

Selection of charged-current muon-neutrino and electron-neutrino interactions in the DUNE far detector

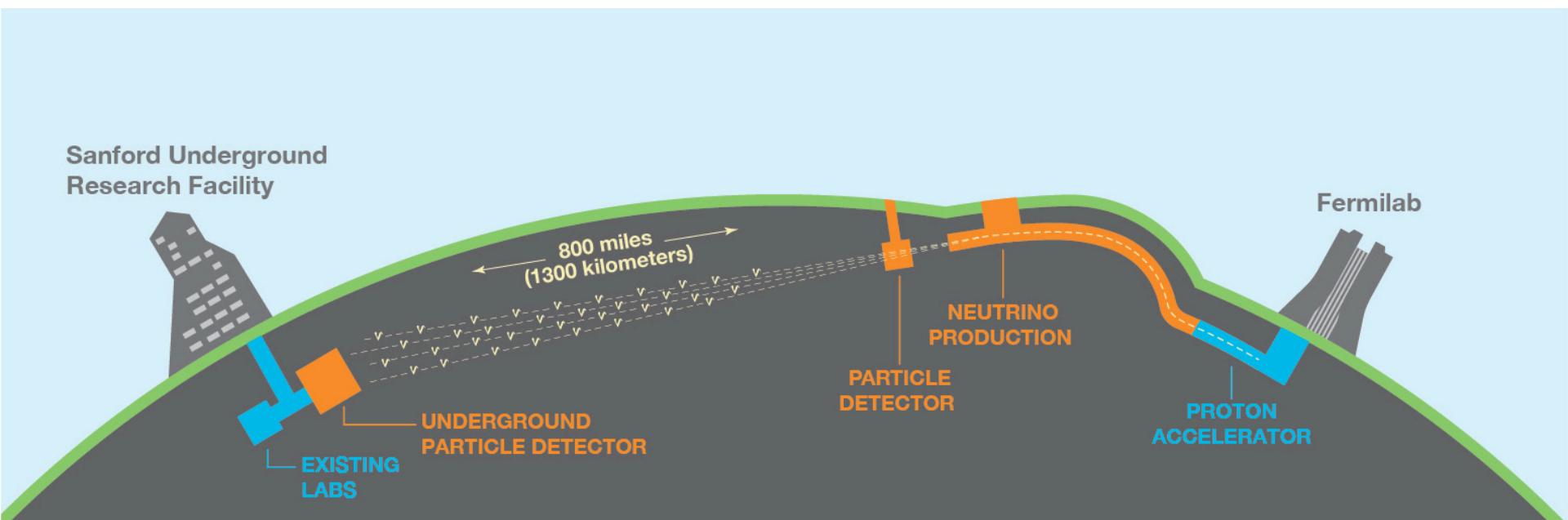
Dominic Brailsford for the DUNE collaboration

Division of Particles and Fields Conference 2017

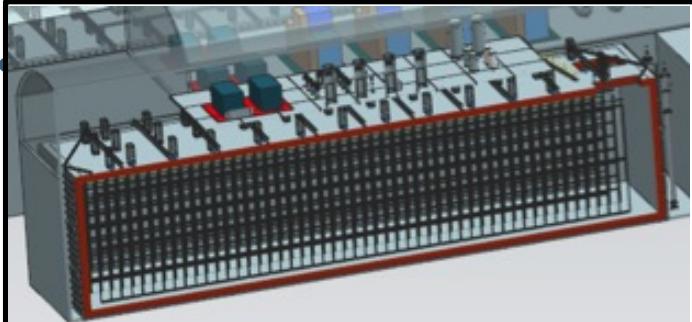
03/08/2017

The what?

- The Deep Underground Neutrino Experiment (DUNE)
 - Future long-baseline neutrino oscillation experiment
 - Consists of two sites 1300 km apart
 - A new MW-scale wideband ν_μ beam with separate ν and $\bar{\nu}$ with mode
 - Will measure both ν_μ disappearance and ν_e appearance

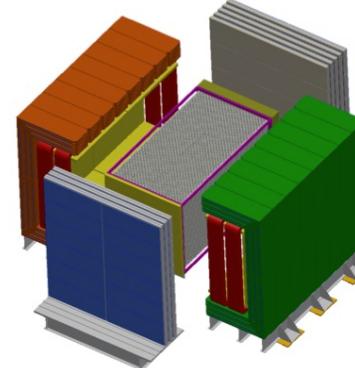


The what?



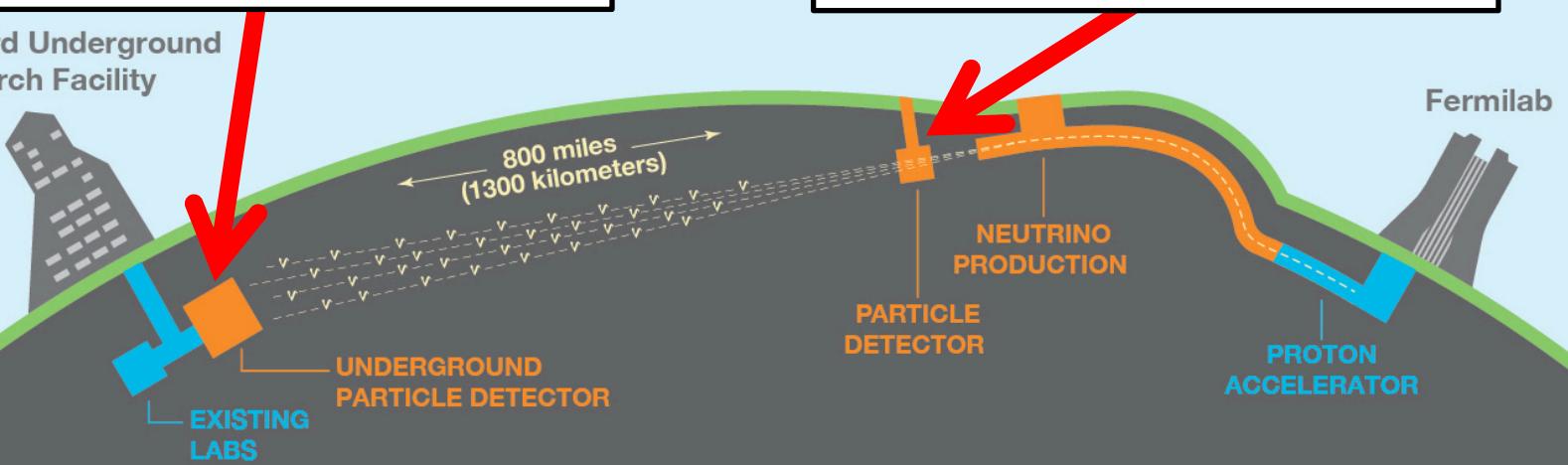
- 4x10 kt **Liquid Argon TPCs** (LArTPC)
- Measures oscillated neutrino rates

Neutrino
trino osc
0 km apa
nd ν_μ bea



- Near detector under design
- Measures un-oscillated neutrino flux

Sanford Underground Research Facility

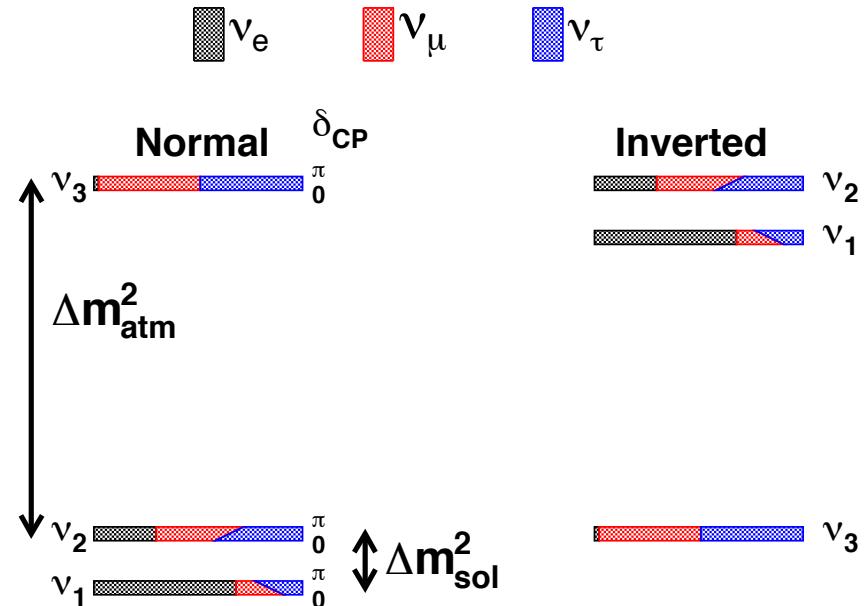


The why?

The PMNS neutrino mixing matrix

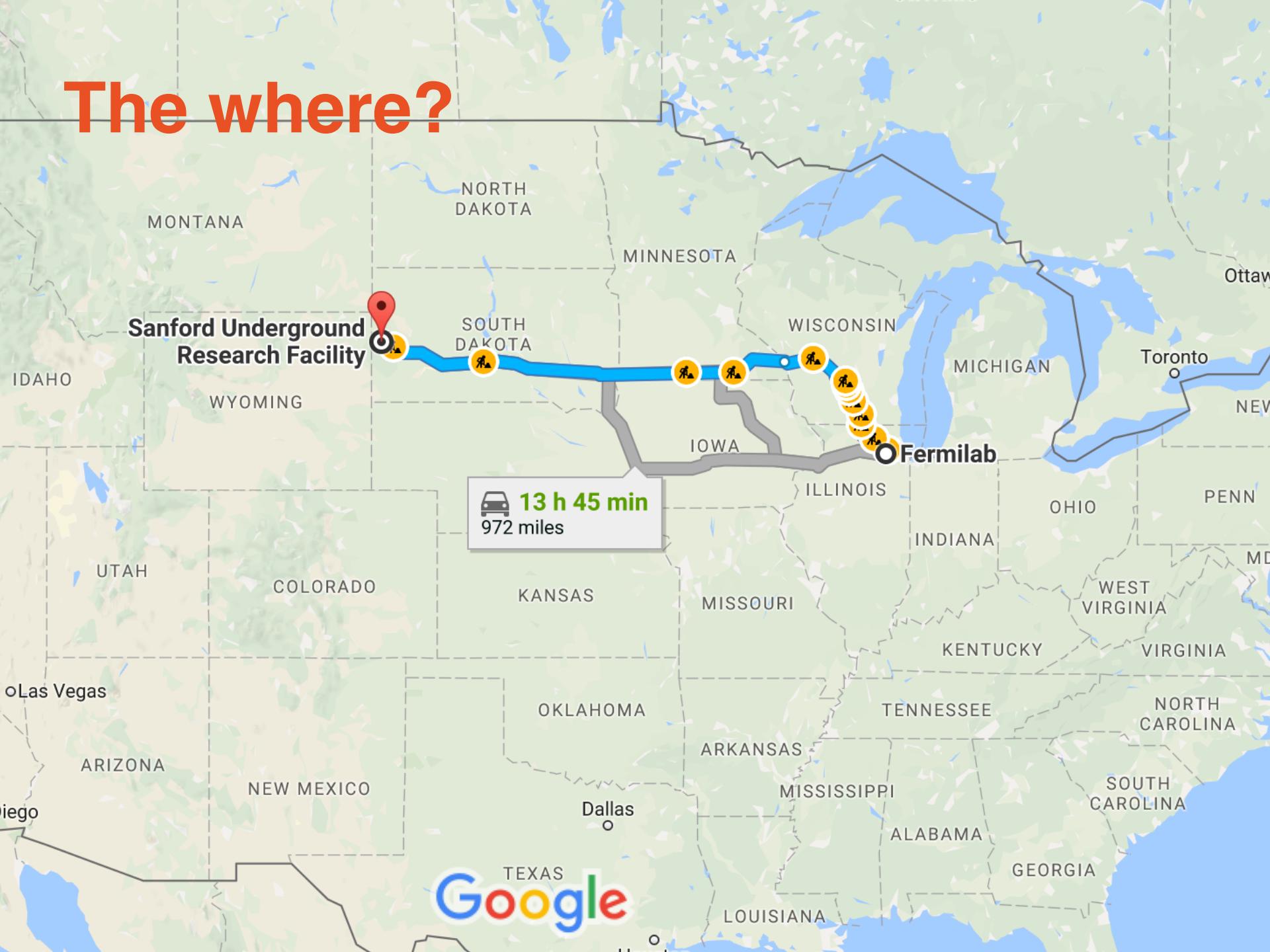
$$\begin{pmatrix} 1 & 0 & 0 \\ 0 & \cos \theta_{23} & \sin \theta_{23} \\ 0 & -\sin \theta_{23} & \cos \theta_{23} \end{pmatrix} \begin{pmatrix} \cos \theta_{13} & 0 & \sin \theta_{13} e^{-i\delta} \\ 0 & 1 & 0 \\ -\sin \theta_{13} e^{i\delta} & 0 & \cos \theta_{13} \end{pmatrix} \begin{pmatrix} \cos \theta_{12} & \sin \theta_{12} & 0 \\ -\sin \theta_{12} & \cos \theta_{12} & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

- All mixing angles measured to be non-zero, opening the door to measurements of the CP-violating phase δ
- Questions:
 - Does CP violation occur in the neutrino sector? ($\sin \delta \neq 0$?)
 - Is θ_{23} maximal? ($\theta_{23} = 45^\circ$?)
 - What is the neutrino mass ordering?



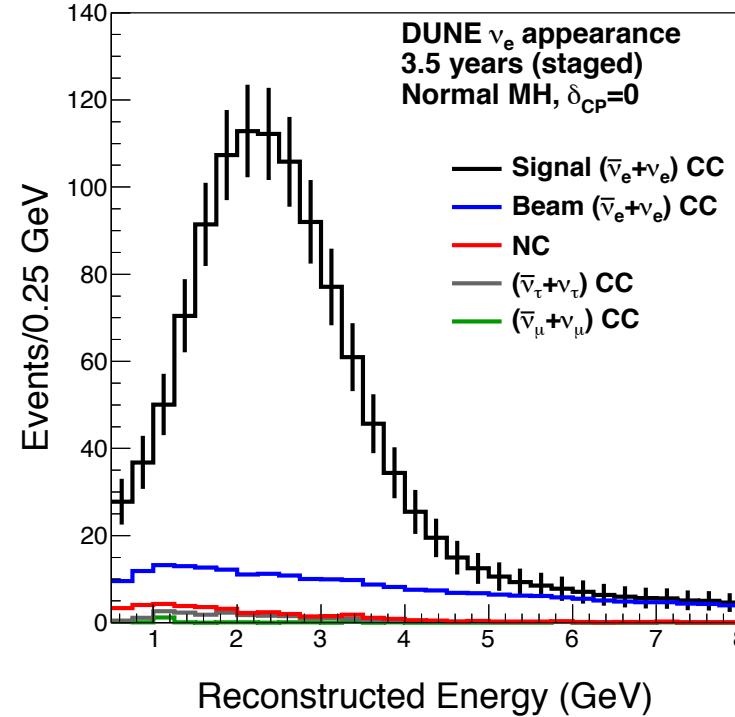
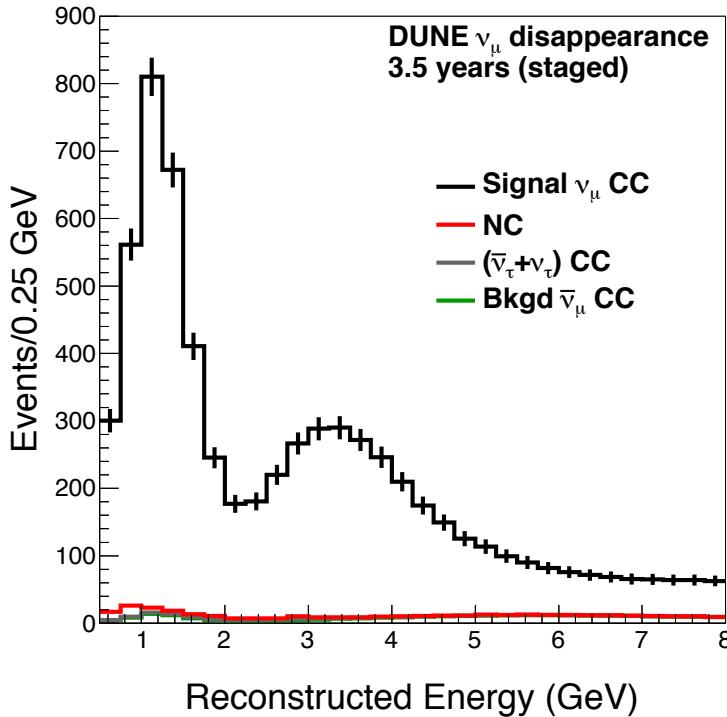
X. Qian and P. Vogel, Progress in Particle and Nuclear Physics 83, 1 (2015)

The where?



The measurement necessities

To make measurements of neutrino oscillation parameters we need to identify oscillated neutrinos in the DUNE far detector



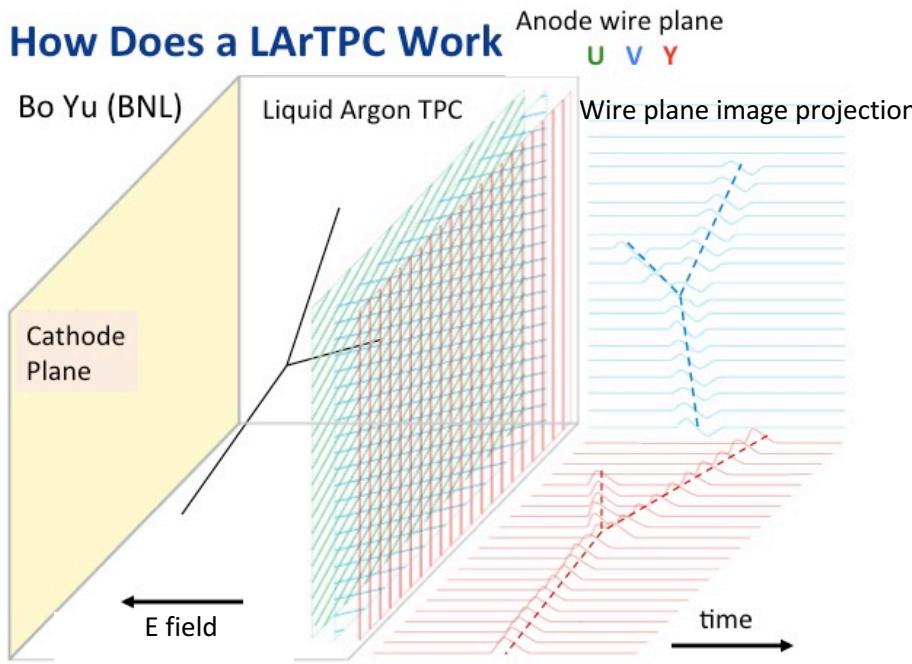
Acquiring such samples requires:

- Fully automated reconstruction
- **Fully automated selections**

Distributions produced using
DUNE's 'Fast MC' (truth
smearing and parameterised
detector efficiency)

Liquid Argon TPC reconstruction

How Does a LArTPC Work



- Charged particles ionise argon
- Ionisation electrons drift in electric field
- Wire planes at anode record current from drifting electrons

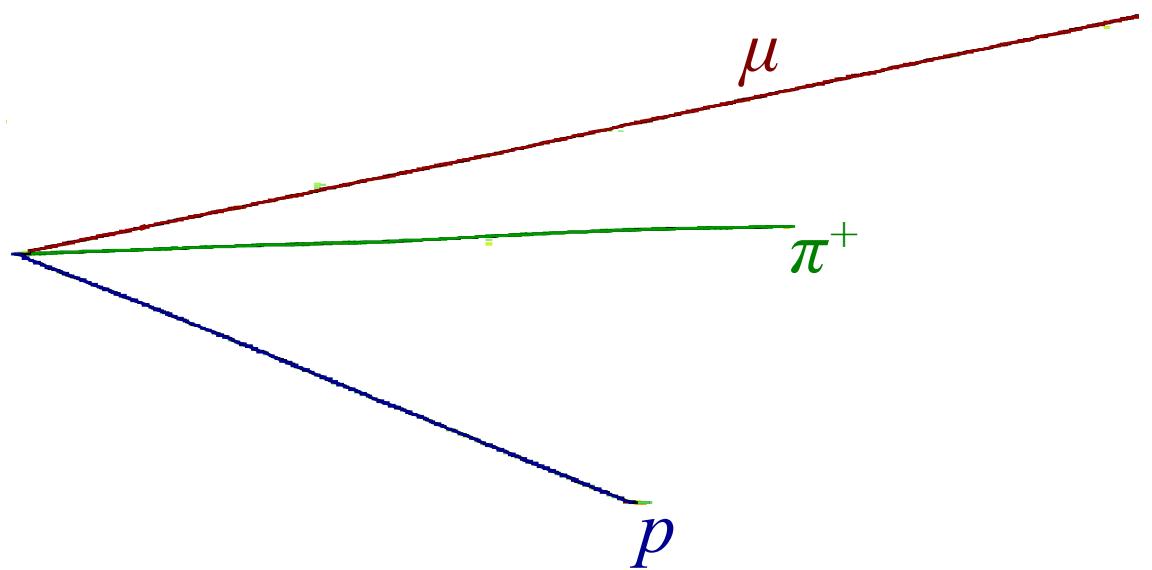
- [LArSoft](#): a fully automated software chain:
 - Physics simulation
 - Detector response simulation
 - Signal processing
 - Hit reconstruction
 - Pattern recognition
 - Track and shower reconstruction
 - Calorimetry

T. Yang, "Automated Reconstruction, Signal Processing and Particle Identification in DUNE," PoS ICHEP 2016, 183 (2016)

The CC ν_μ selection

- Selection is a Multi-Variate Analysis (MVA)
- The selection is split into two parts:
 - Fiducial volume requirement
 - 17-variable Boosted Decision Tree (BDT)
- BDT assesses characteristics of
 - The whole interaction
 - The longest track
- The BDT inputs include...

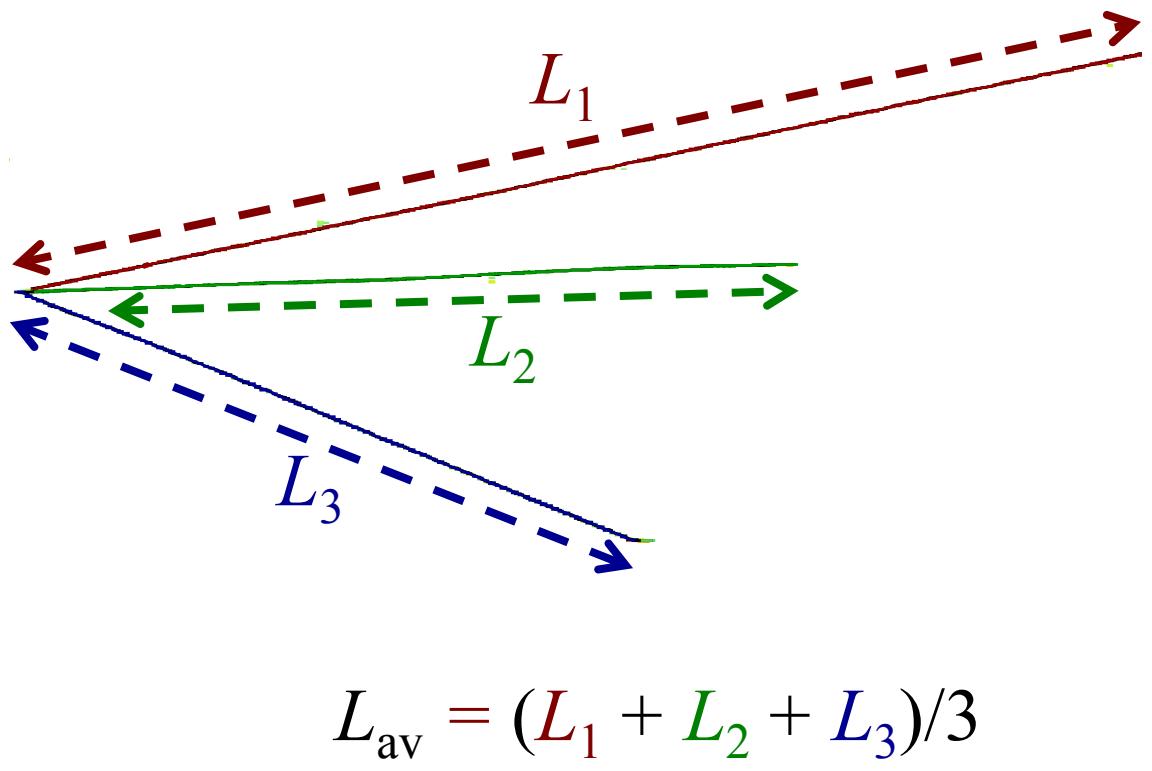
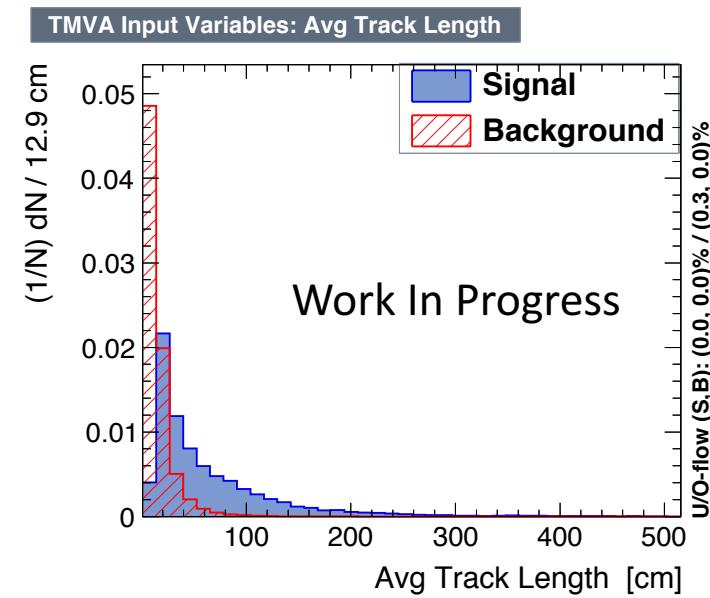
Reconstruction of a simulated CC ν_μ interaction



Alternative selection: A. Radovic, “Deep Learning and DUNE”, Computing, Analysis Tools and Data Handling, DPF 2017

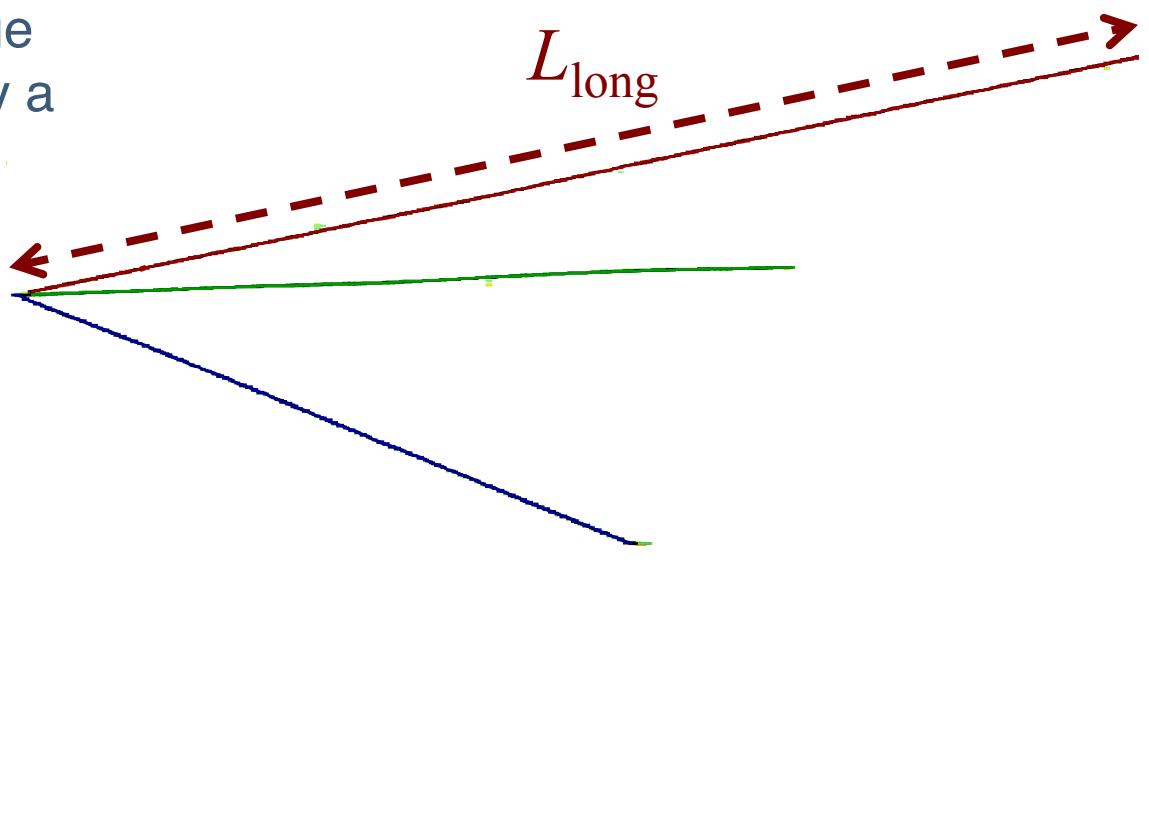
The CC ν_μ selection

- Average reconstructed track length
 - Arithmetic mean
 - No weighting



The CC ν_μ selection

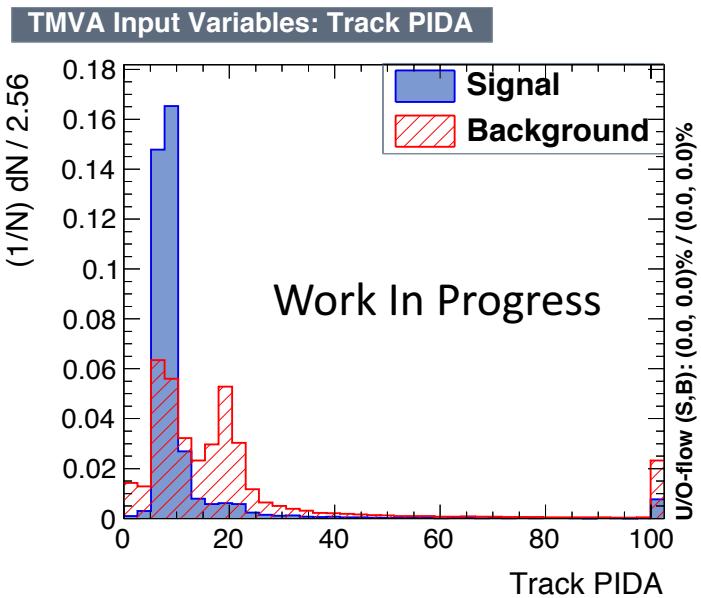
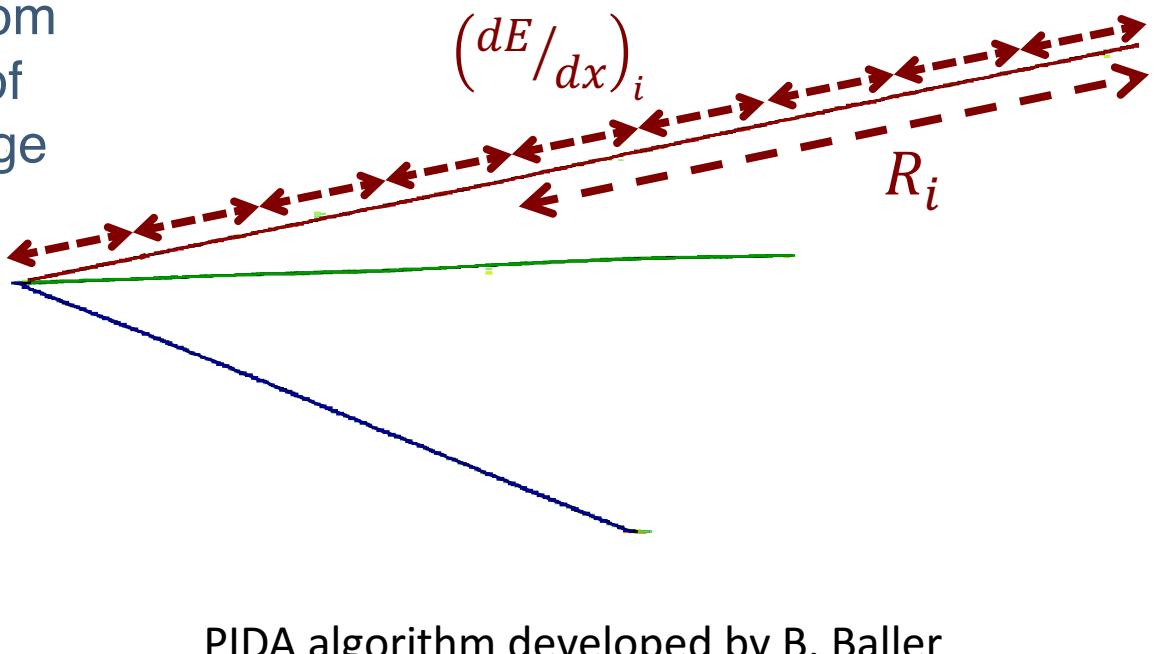
- The length of the longest track
 - Value tends to be large when track created by a muon



The CC ν_μ selection

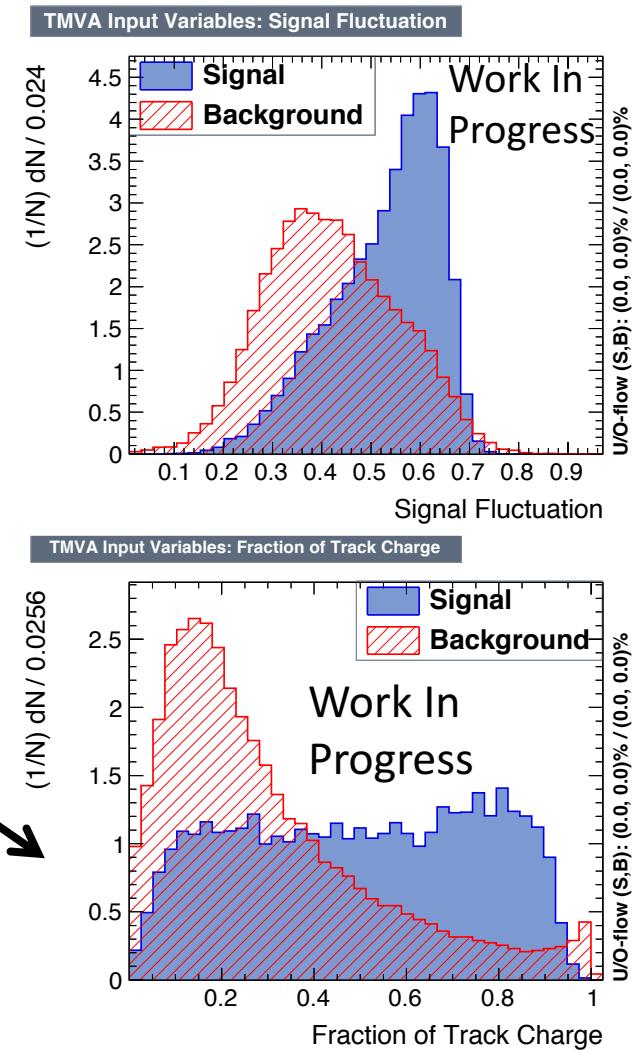
- PIDA parameter of longest track
 - Average value of A from all measured values of dE/dx vs. residual range

$$\left(\frac{dE}{dx}\right)_i = A_i R_i^{0.42} \rightarrow A_i = \left(\frac{dE}{dx}\right)_i R_i^{-0.42}$$

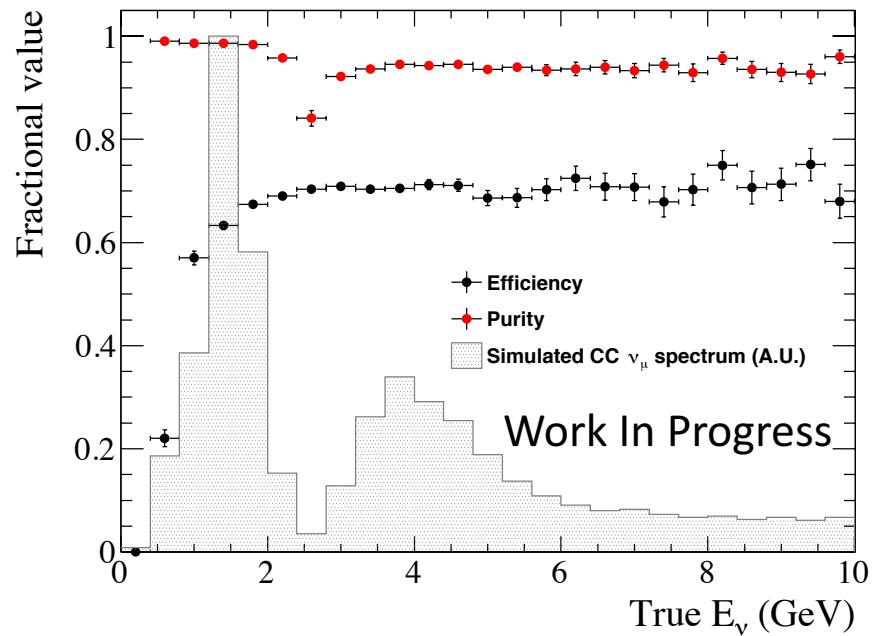
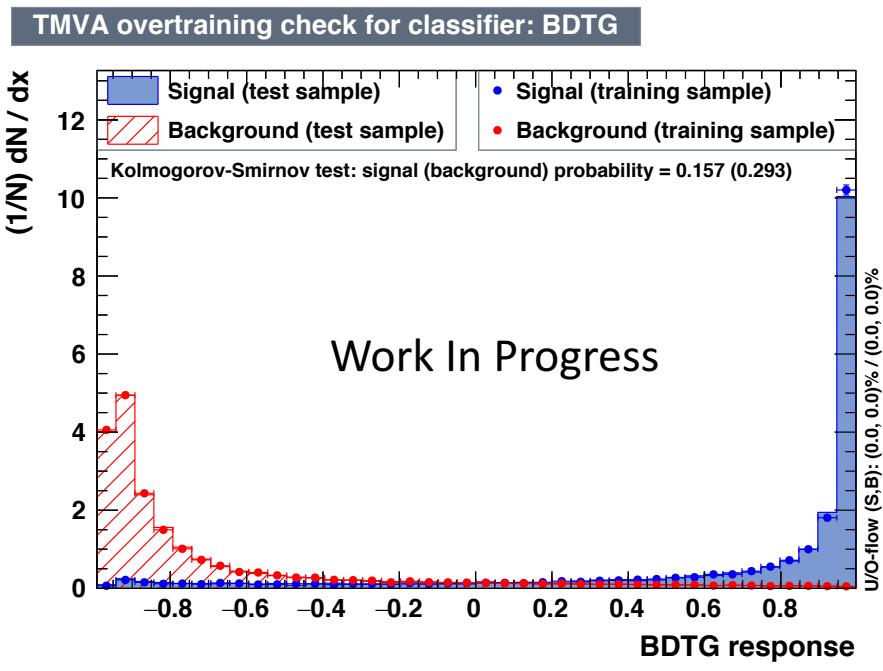


The CC ν_μ selection

- Number of reconstructed tracks
- Total charge in readout window as measured by the collection plane wires
- dE/dx of longest track
- Ratio of lowest 50% to highest 50% of measured charge
- Fraction of charge within 200 detector clock ticks of longest track
- Fraction of the total measured charge contained on longest track
- Maximum fraction of charge contained on neighboring 5, 10, 50 and 100 wires
- Angle of longest track w.r.t the beam axis
- Longest track's fractional transverse energy



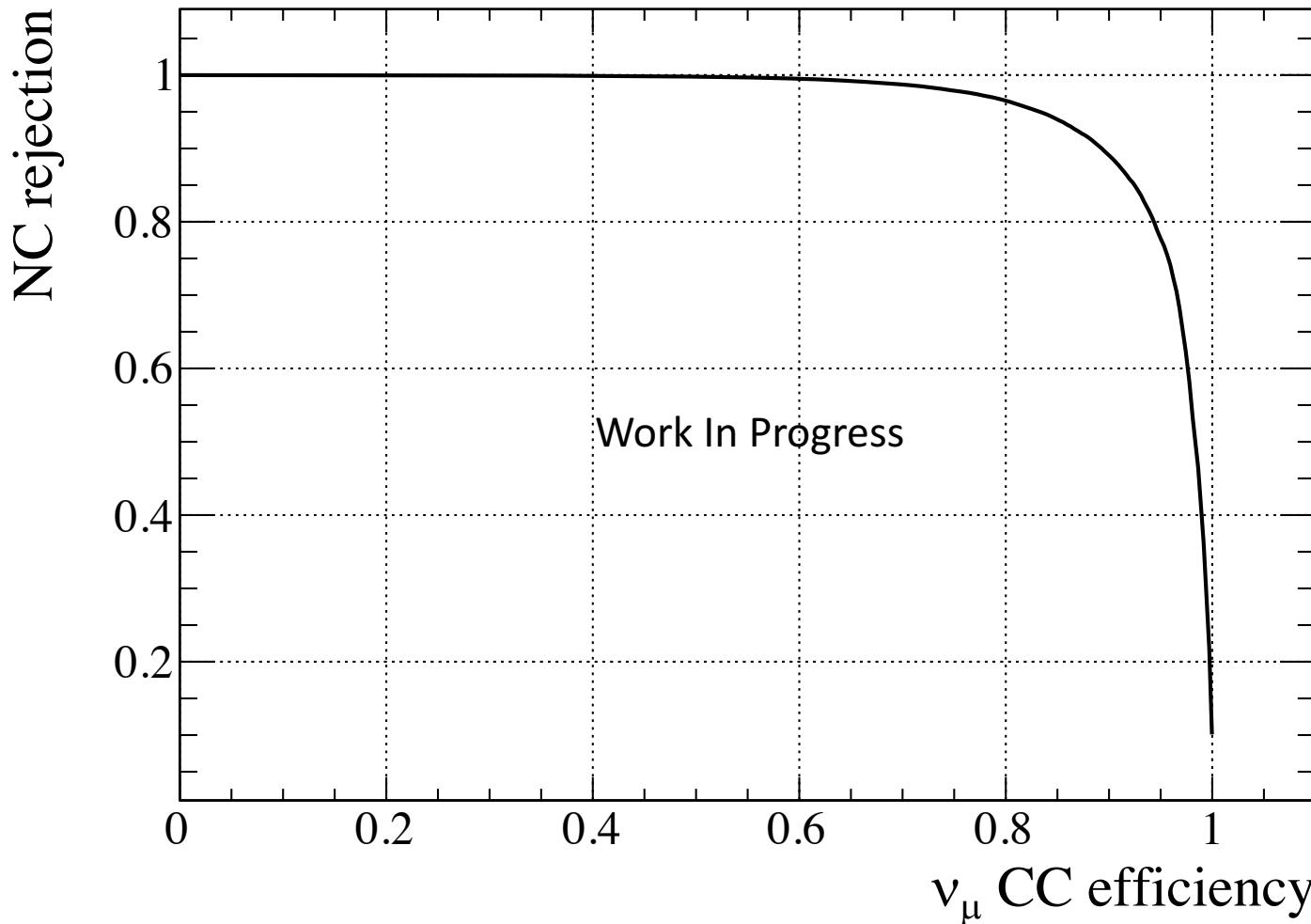
The CC ν_μ selection



BDT classifier shows excellent separation with no signs of over-training

Efficiency and purity vs. trueneutrino energy when selecting reconstructed event with a BDT response > 0.8

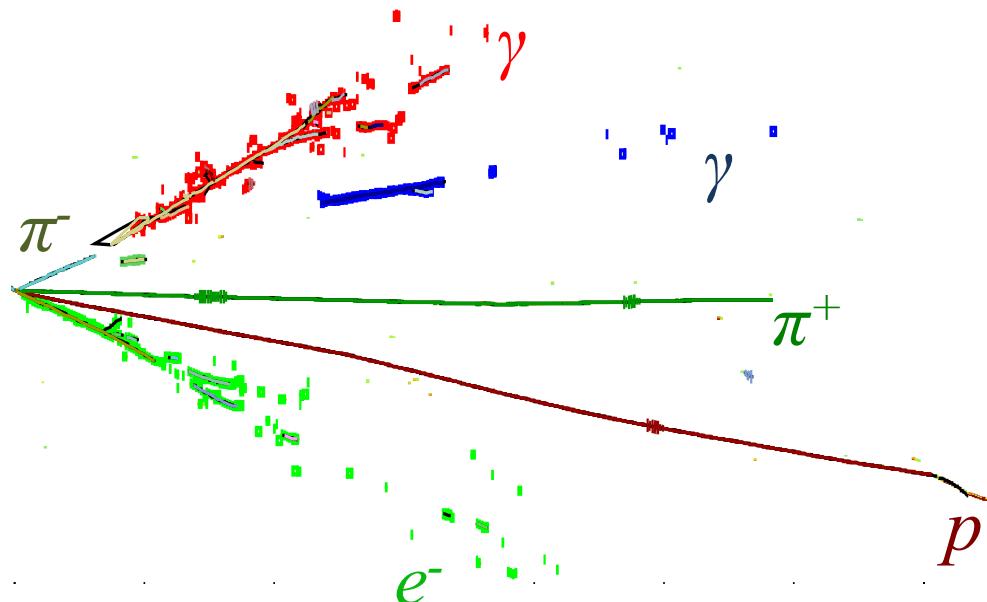
The CC ν_μ selection



The CC ν_e selection

- Selection of CC ν_e is very similar to the CC ν_μ selection
 - Fiducial volume cut followed by BDT
 - BDT uses 30 inputs
 - The same 17 inputs as the CC ν_μ BDT
 - Additional 13 inputs
- BDT assesses characteristics of
 - The whole interaction
 - The longest track
 - **The highest energy shower**
- These additional variables include...

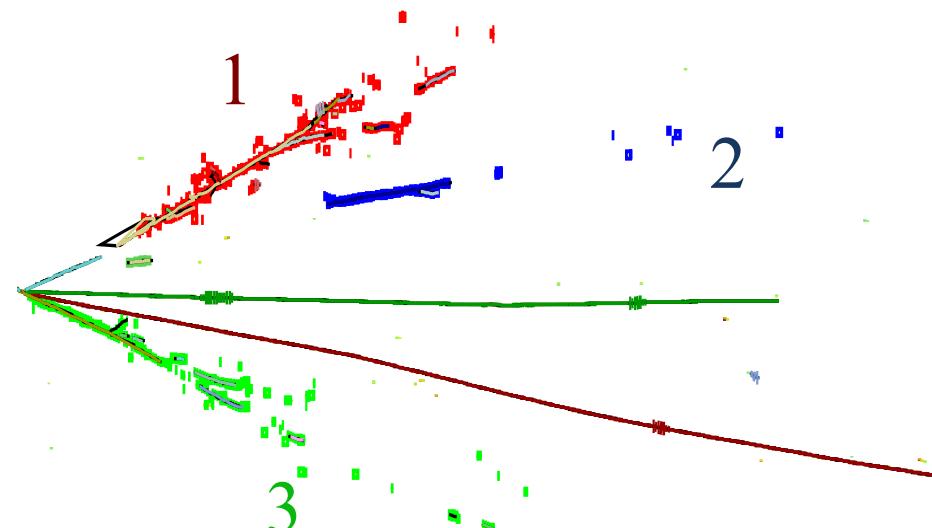
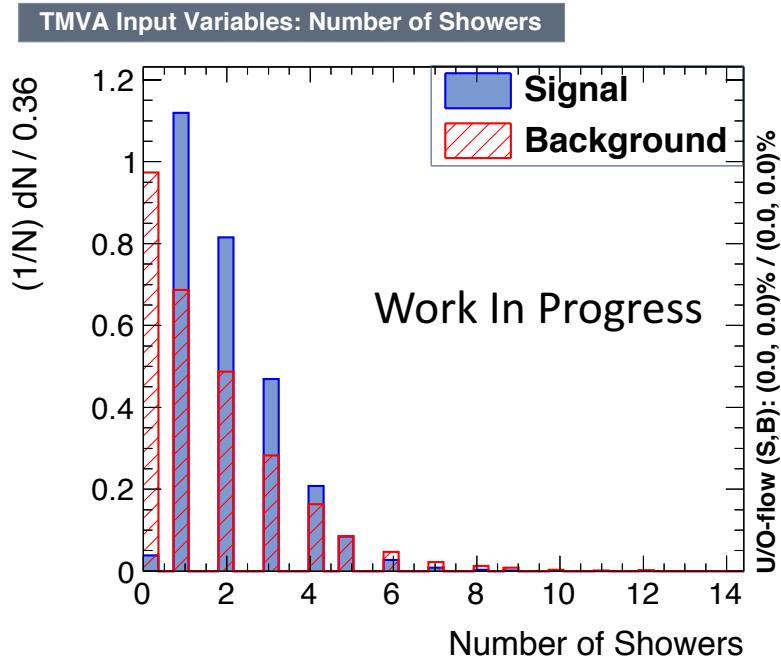
Reconstruction of a simulated CC ν_e interaction



Alternative selection: A. Radovic, "Deep Learning and DUNE", Computing, Analysis Tools and Data Handling, DPF 2017

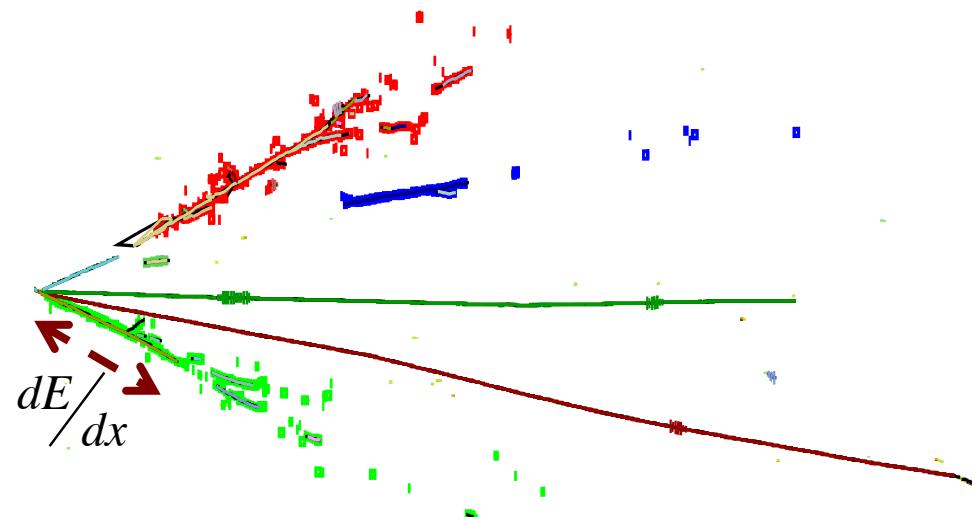
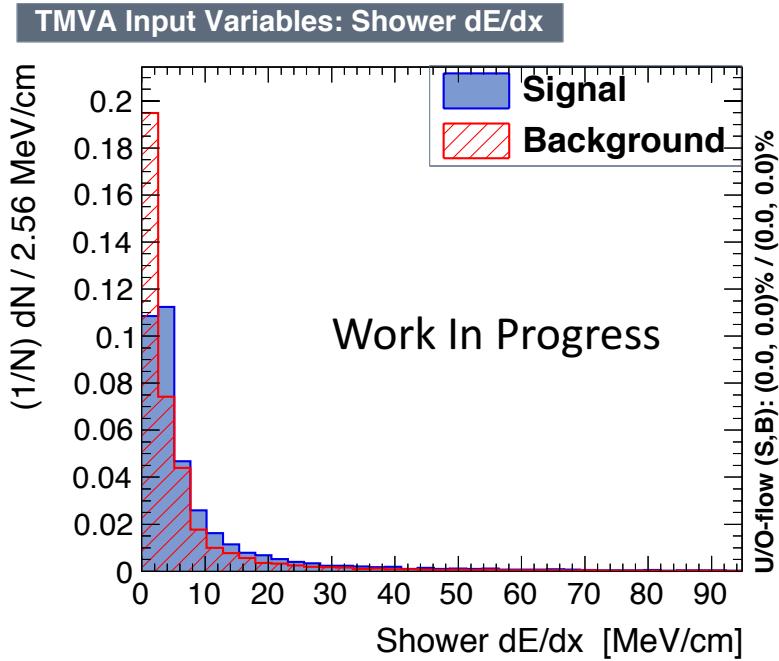
The CC ν_e selection

- The number of reconstructed showers



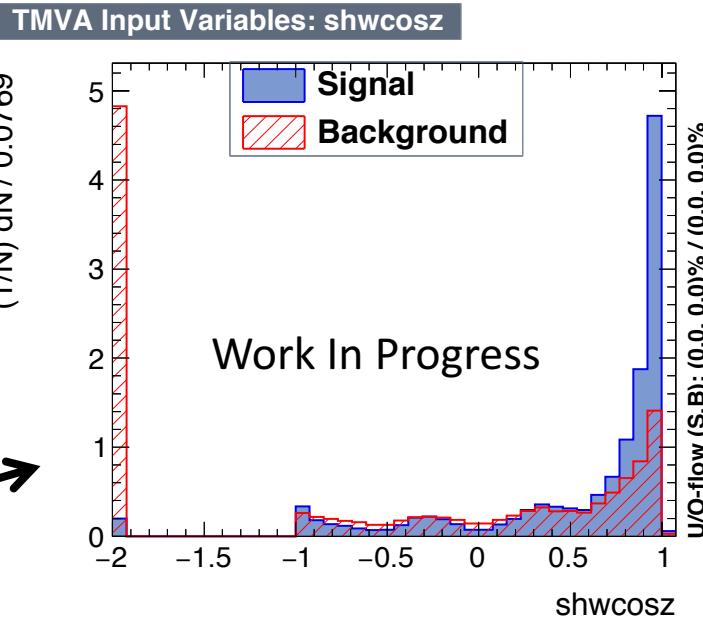
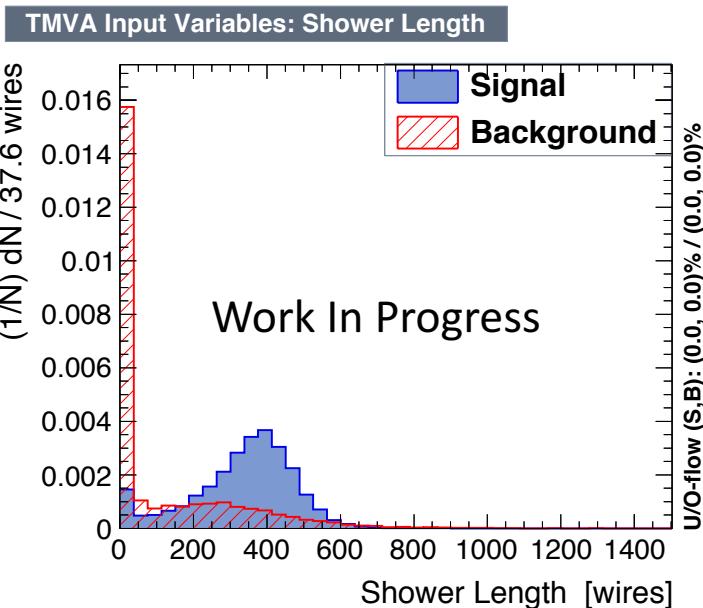
The CC ν_e selection

- dE/dx of the shower
 - Calculated using the first 3 cm of the shower



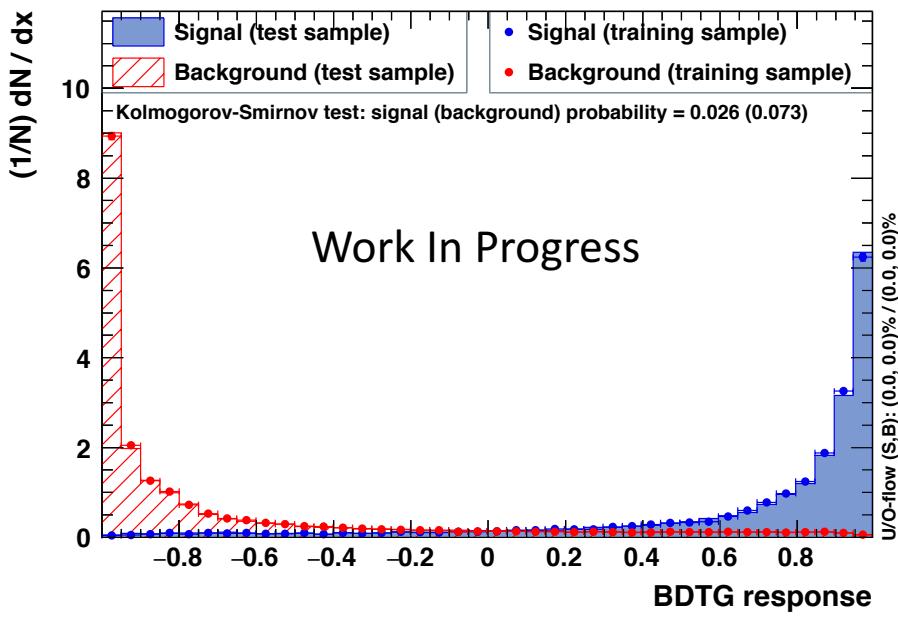
The CC ν_e selection

- Total energy of the Highest Energy Shower (HES)
- Fraction of the total measured charged contained in the HES
- Length of the HES
 - Length defined in wires
- Number of reconstructed HES hits per shower hitting wire
- Fractional position along the HES to maximal charge
 - Position defined in wires
- Distance from the HES start point to the neutrino vertex
- Angle of HES w.r.t. the beam axis

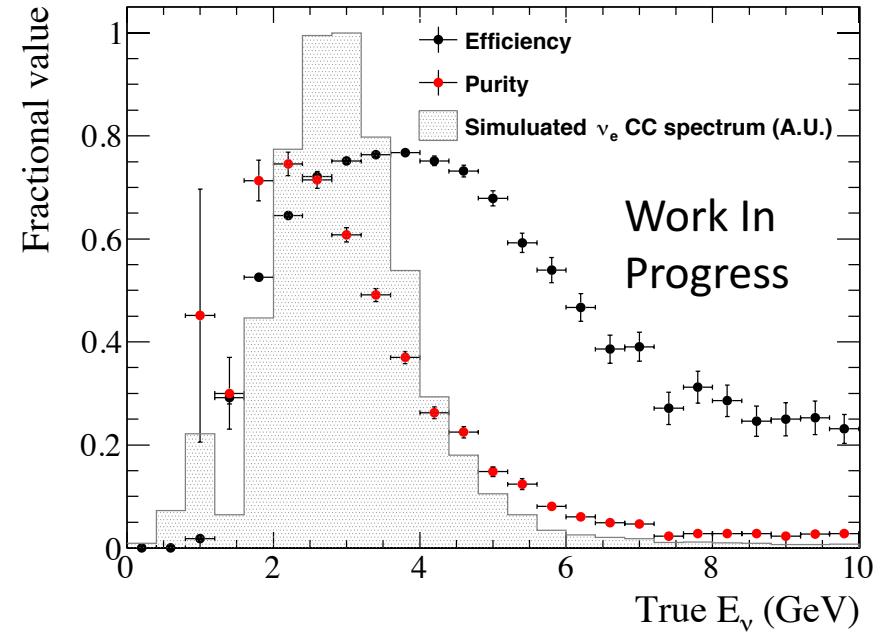


The CC ν_e selection

TMVA overtraining check for classifier: BDTG

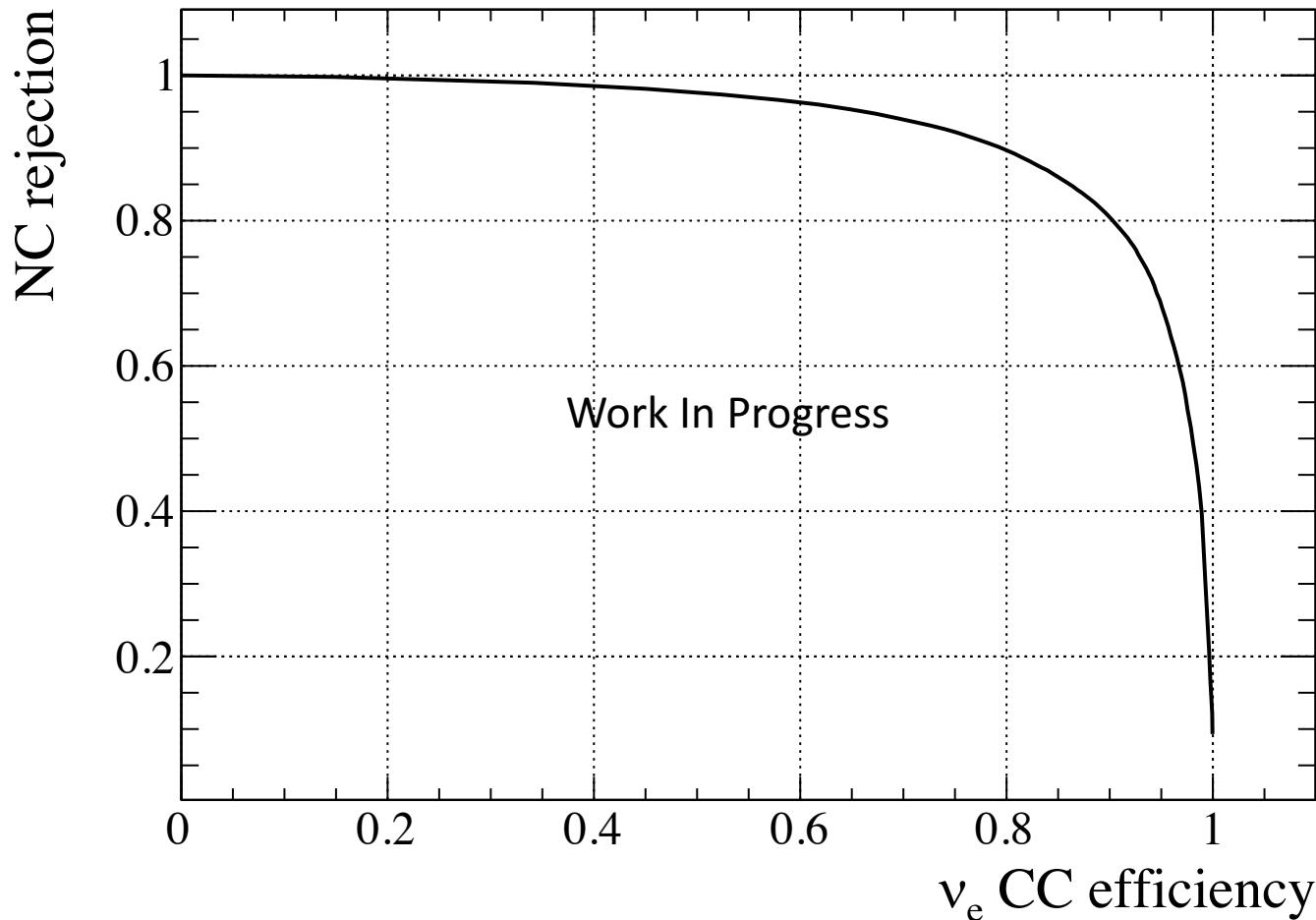


BDT classifier shows excellent separation with no signs of over-training



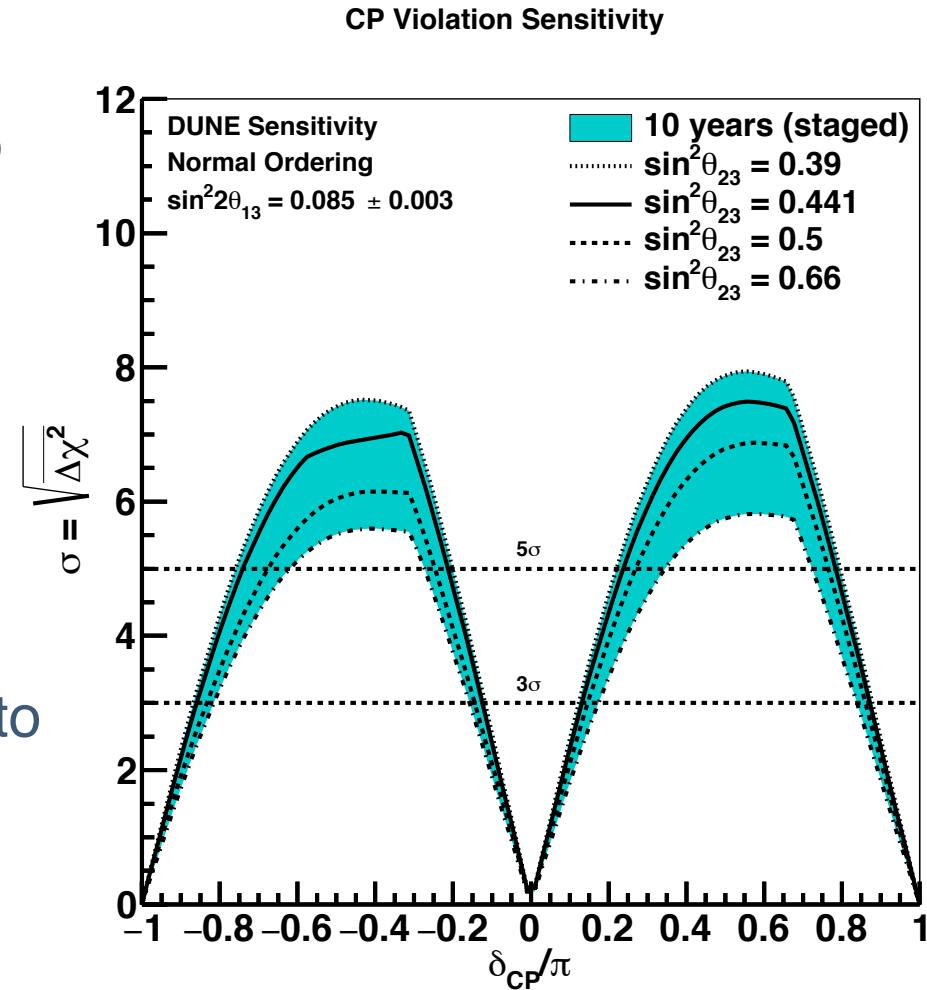
Efficiency and purity vs. simulated neutrino energy when selecting reconstructed event with a BDT response > 0.8

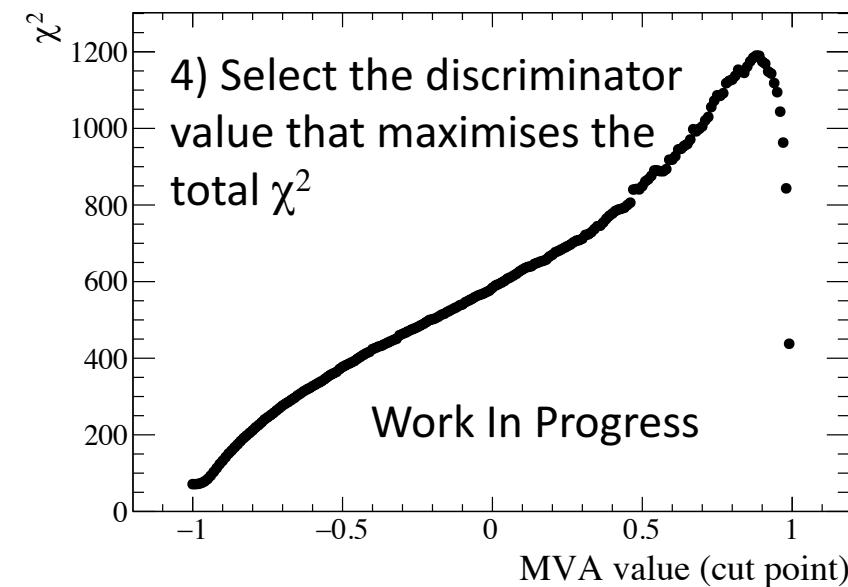
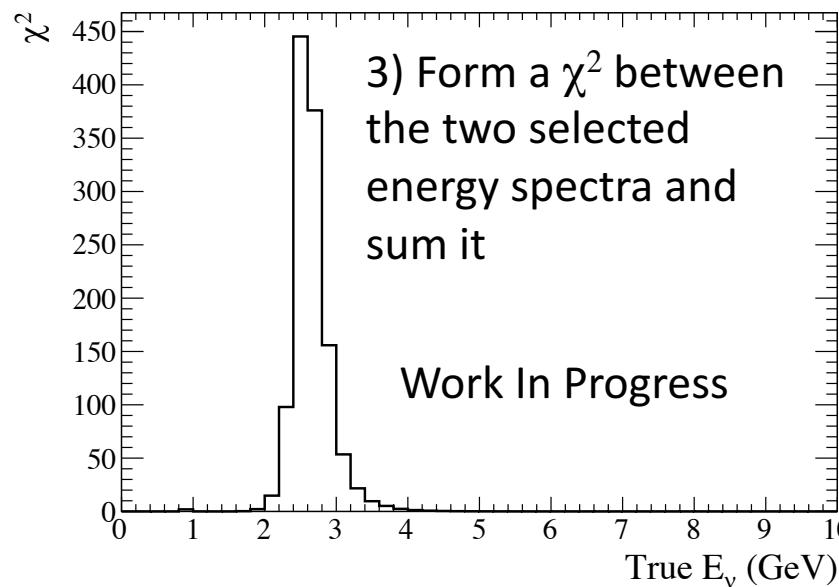
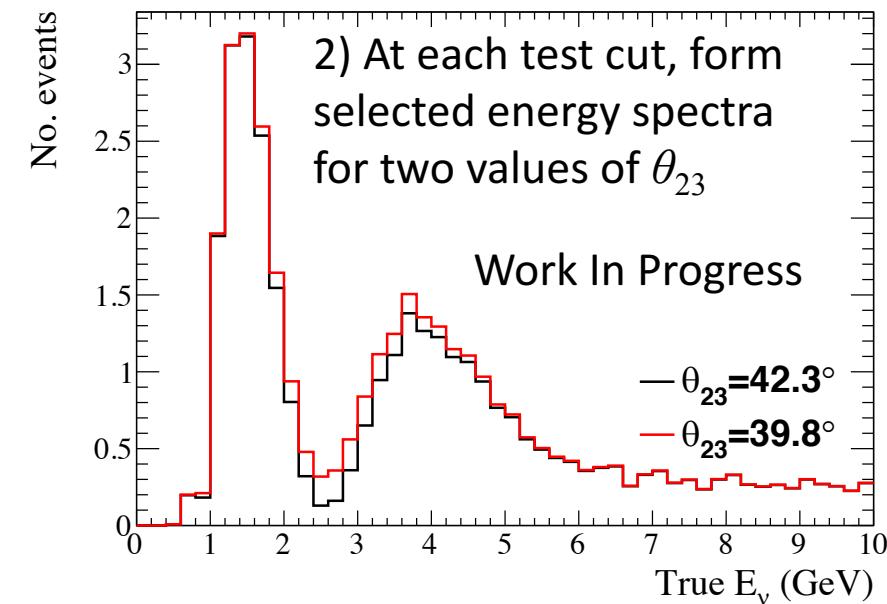
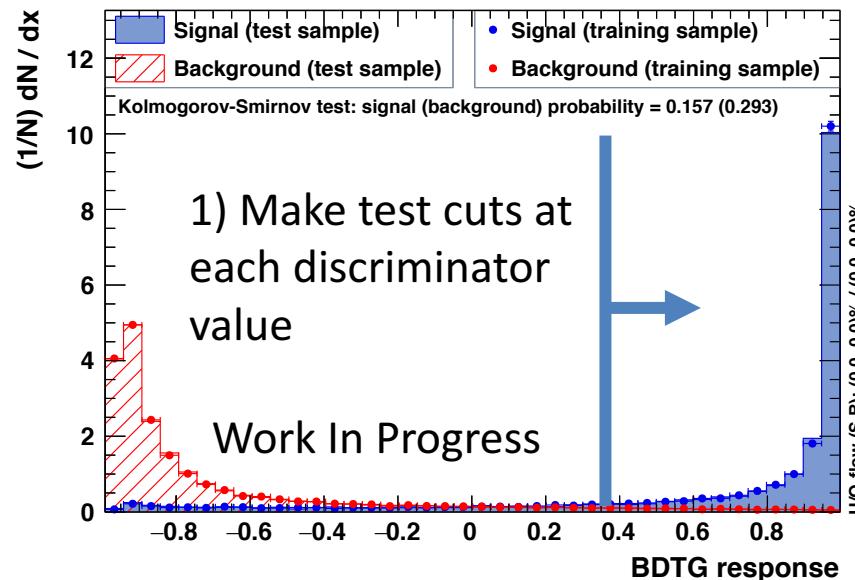
The CC ν_e selection



CC ν_μ selection tuning

- RHS plot shows DUNE's ability to determine δ_{CP} for different values of θ_{23}
- ν_μ disappearance provides a precision handle on θ_{23}
- The ν_μ selection should be tuned to maximise its sensitivity to θ_{23}
- How is this done?

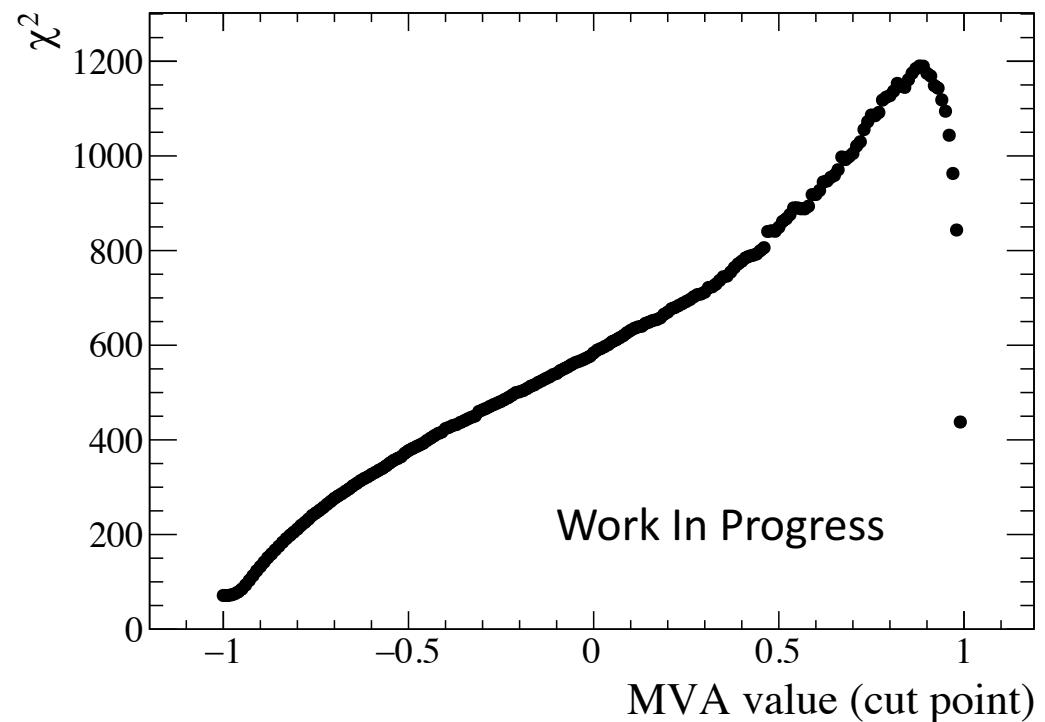




* Inclusion of reconstructed neutrino energy is ongoing

CC ν_μ selection tuning

- RHS plot shows χ^2 distribution for $\theta_{23}=42.3^\circ$ and $\theta_{23}=39.8^\circ$
 - NuFit2014 minimum and -1σ value (normal hierarchy)
- Clear maximum in the χ^2 distribution
 - MVA cut point: 0.88
- Further studies for ν_μ and ν_e are ongoing



Summary

- DUNE is a future long-baseline neutrino oscillation experiment that will utilise liquid argon TPC technology
- Selections for DUNE's neutrino oscillation fits are currently being developed
- The core of both selections is a BDT which shows excellent separation between signal and background
- Selection tuning studies are currently taking place

Thank you



Backups

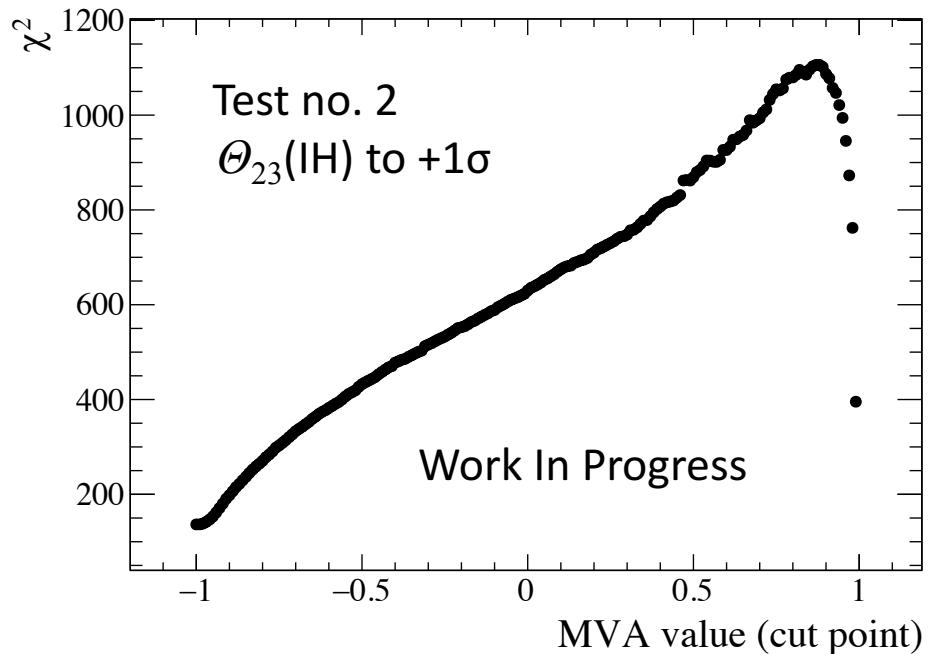
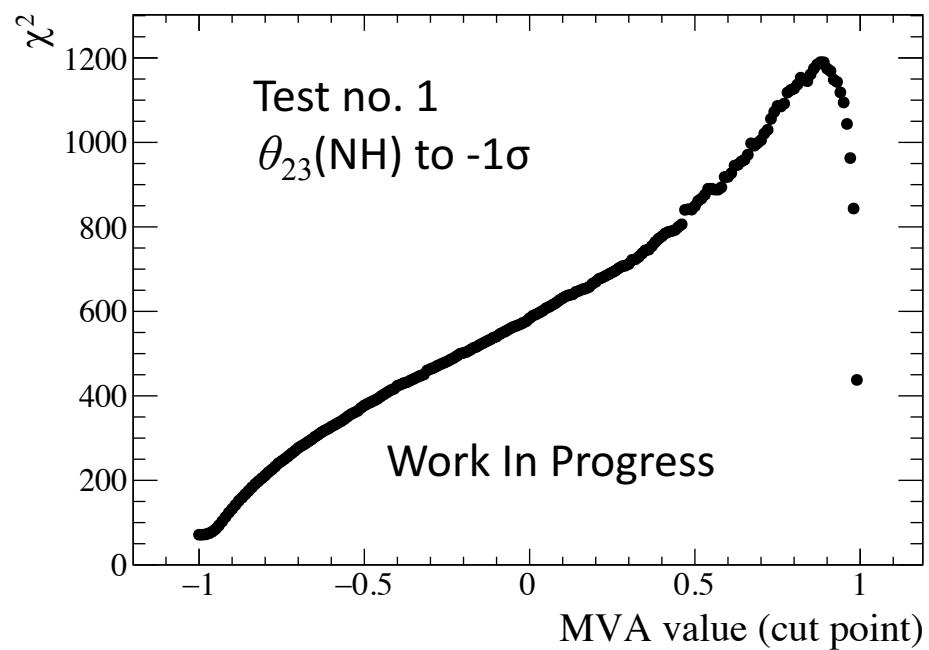
ν_μ selection tuning

Test no.	θ_{23} A (degrees)	θ_{23} B (degrees)	Why?
1	42.3	39.8	$\theta_{23}(\text{NH})$ to -1σ
2	49.5	51.9	$\theta_{23}(\text{IH})$ to $+1\sigma$
3	45	42.3	Max. mix. to $\theta_{23}(\text{NH})$
4	45	49.5	Max. mix. to $\theta_{23}(\text{IH})$
5	42.3	49.5	$\theta_{23}(\text{NH})$ to $\theta_{23}(\text{IH})$

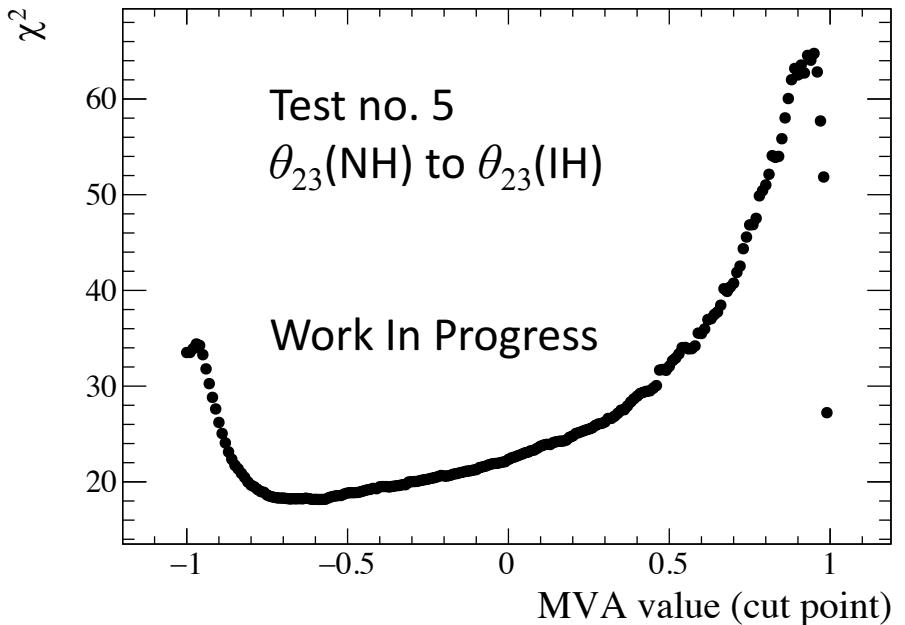
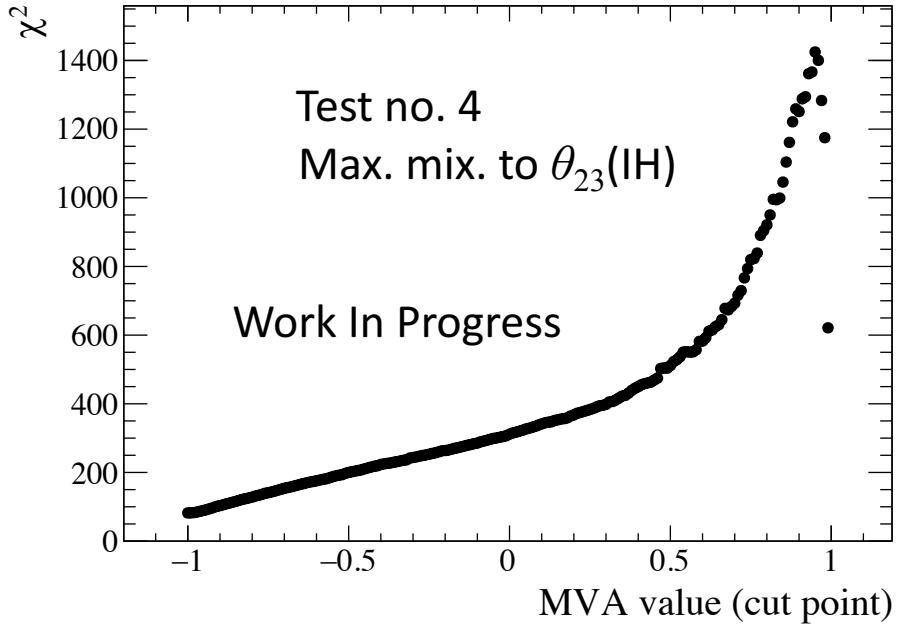
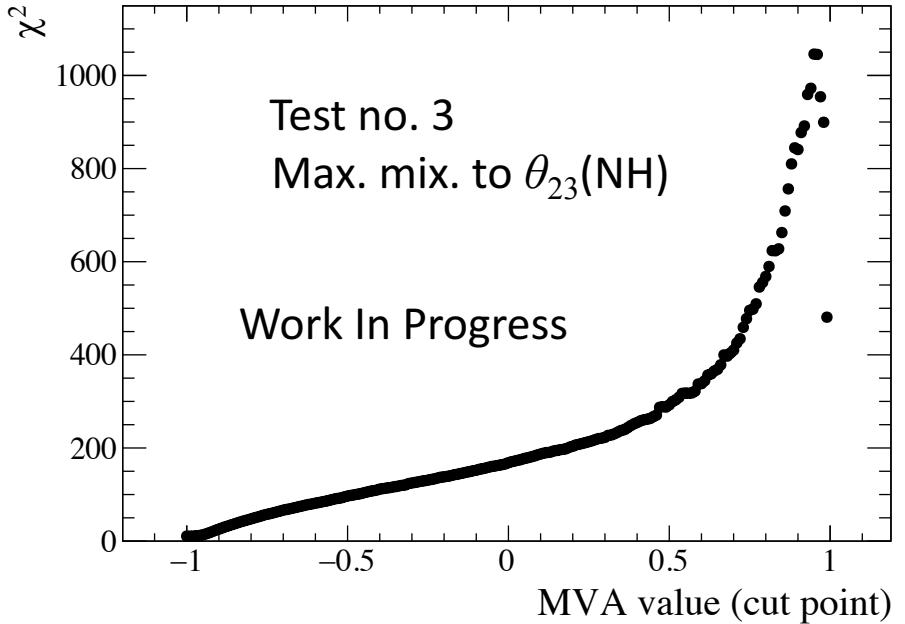
NH: Normal Hierarchy
IH: Inverted Hierarchy

θ_{23} values taken from global fit [REF]

ν_μ selection tuning



Both tests show well defined maxima with comparable χ^2



- Test 3 and test 4 show similar results
 - Test 4 has a higher max χ^2
- Test 5 shows little sensitivity

ν_μ selection tuning

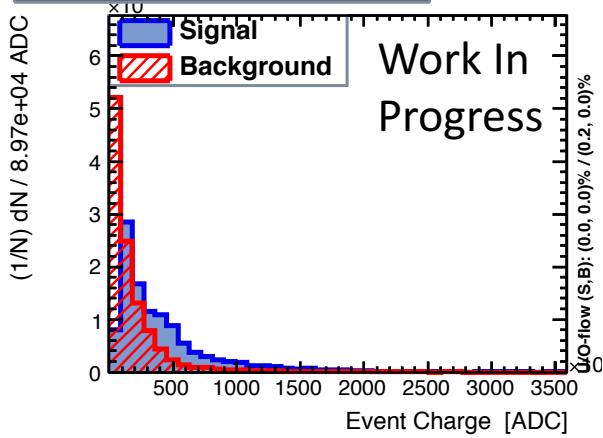
Test no.	θ_{23} A (degrees)	θ_{23} B (degrees)	Why?	MVA val.	Max χ^2
1	42.3	39.8	θ_{23} (NH) to -1σ	0.88	1190.1
2	49.5	51.9	θ_{23} (IH) to $+1\sigma$	0.88	1106
3	45	42.3	Max. mix. to θ_{23} (NH)	0.95	1045.87
4	45	49.5	Max. mix. to θ_{23} (IH)	0.95	1424.7
5	42.3	49.5	θ_{23} (NH) to θ_{23} (IH)	0.95	64.8

NH: Normal Hierarchy
IH: Inverted Hierarchy

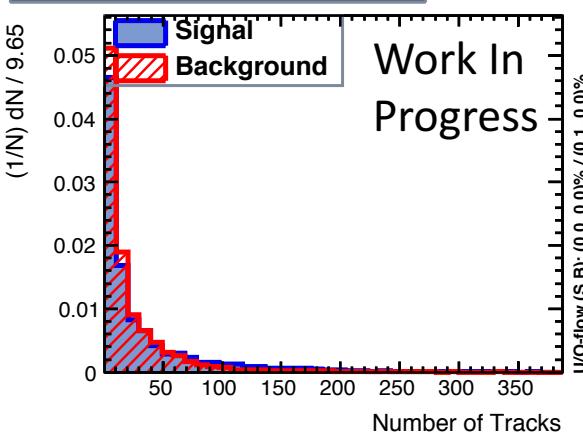
θ_{23} values taken from global fit [REF]

The ν_μ selection

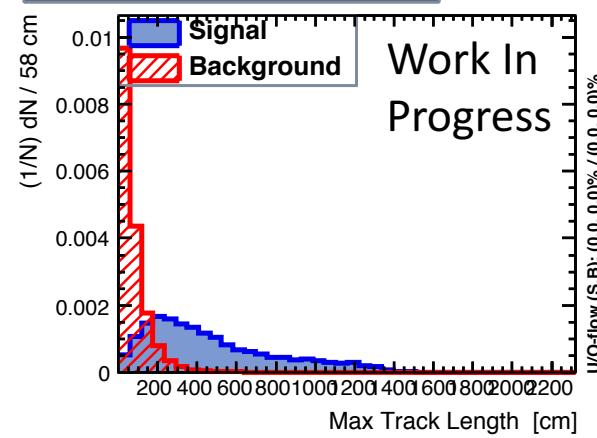
TMVA Input Variables: Event Charge



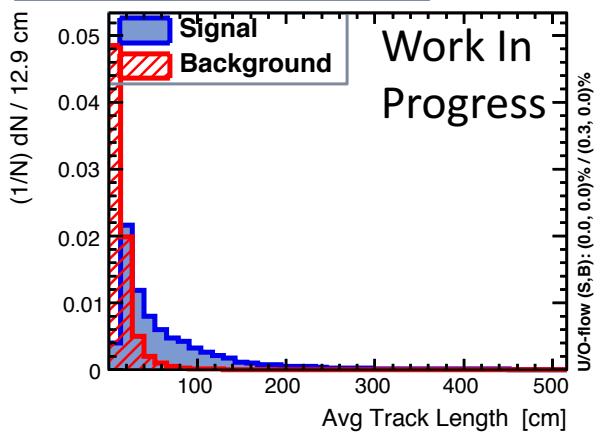
TMVA Input Variables: Number of Tracks



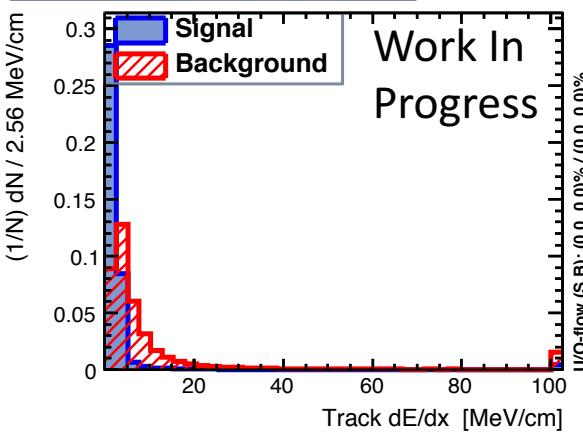
TMVA Input Variables: Max Track Length



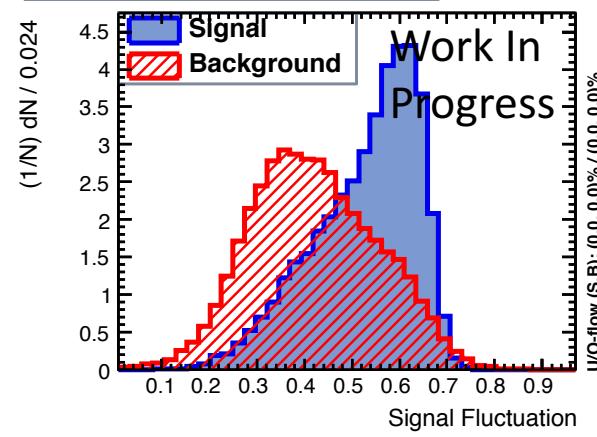
TMVA Input Variables: Avg Track Length



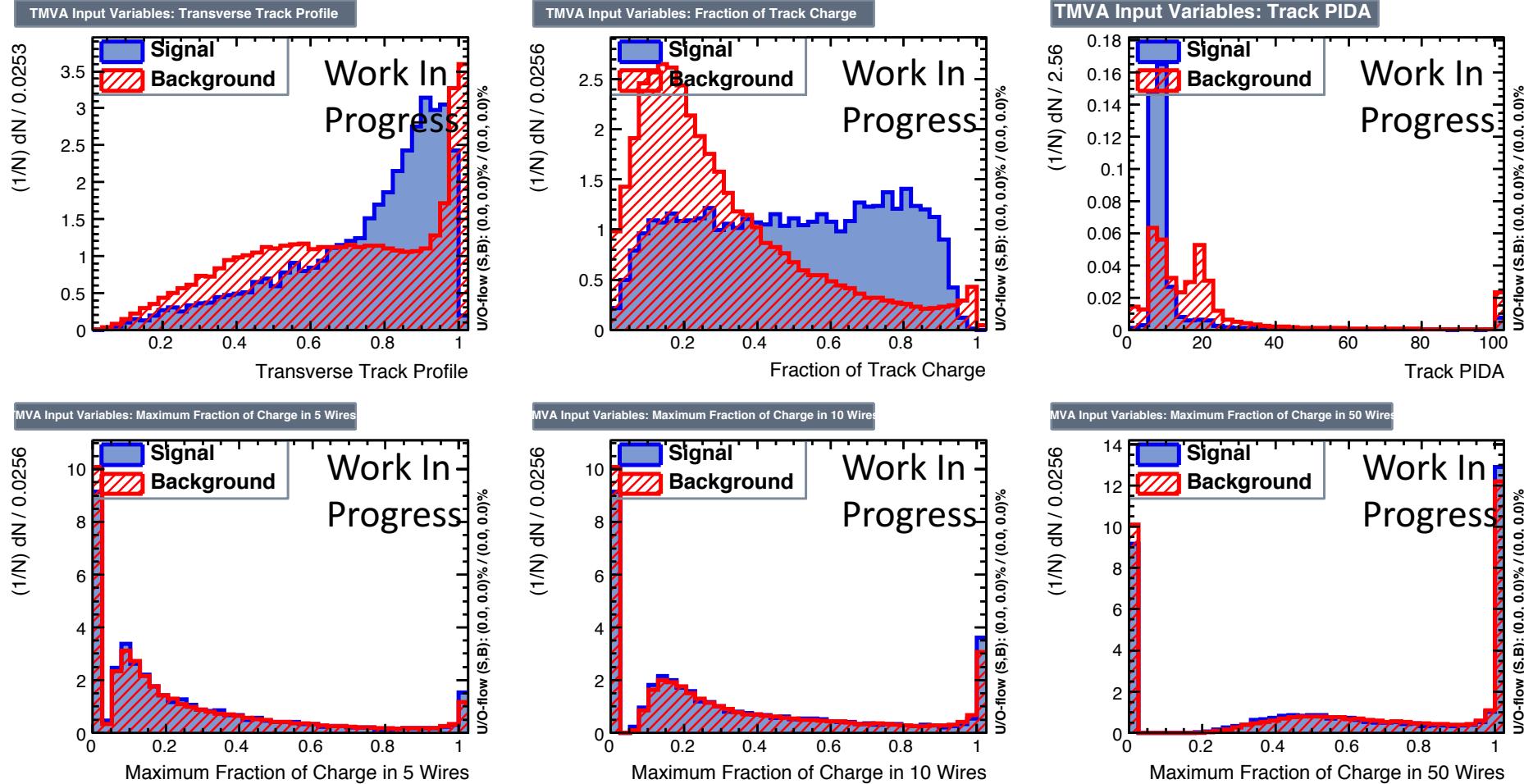
TMVA Input Variables: Track dE/dx



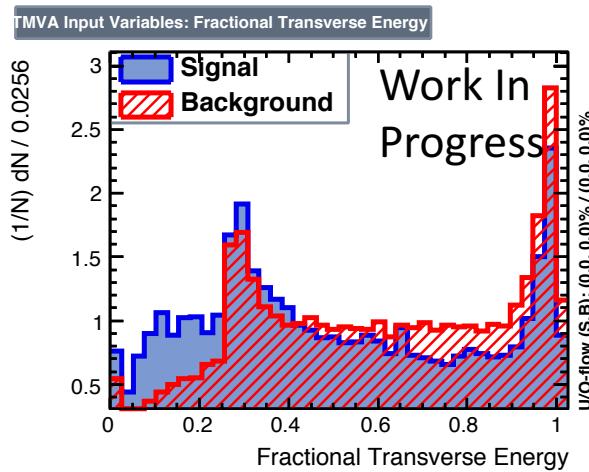
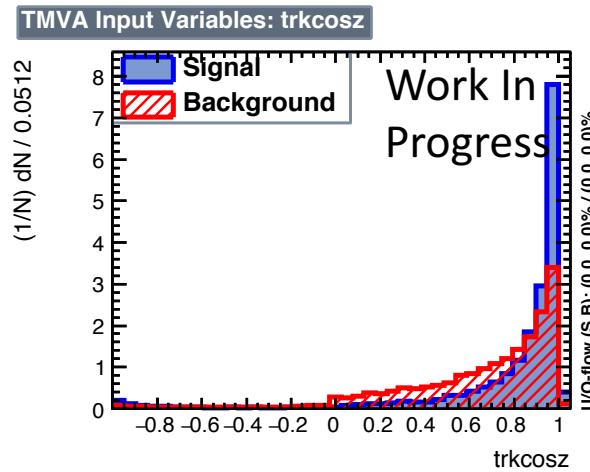
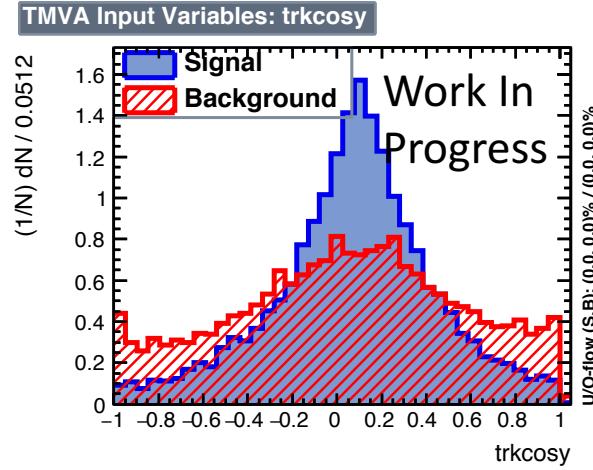
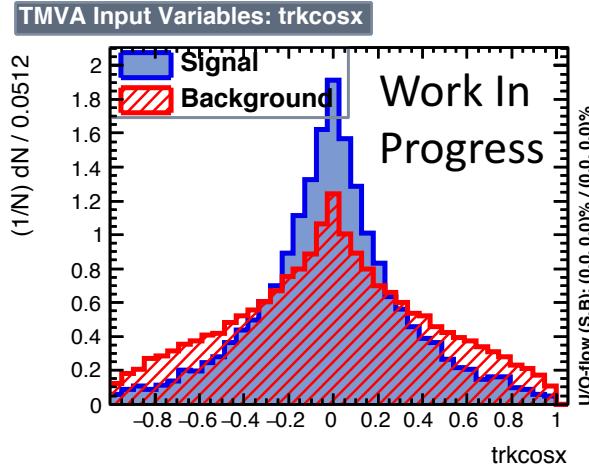
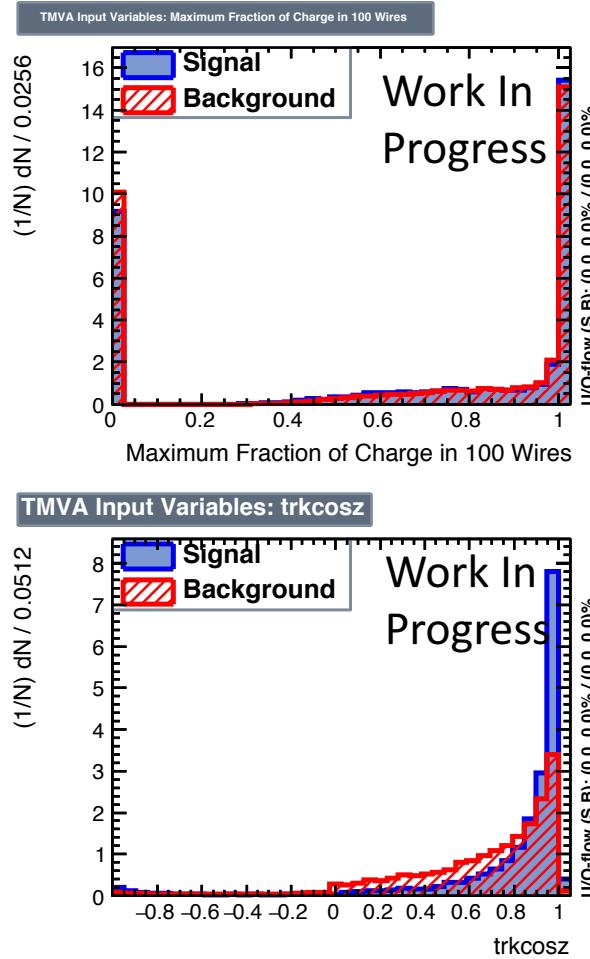
TMVA Input Variables: Signal Fluctuation



The ν_μ selection

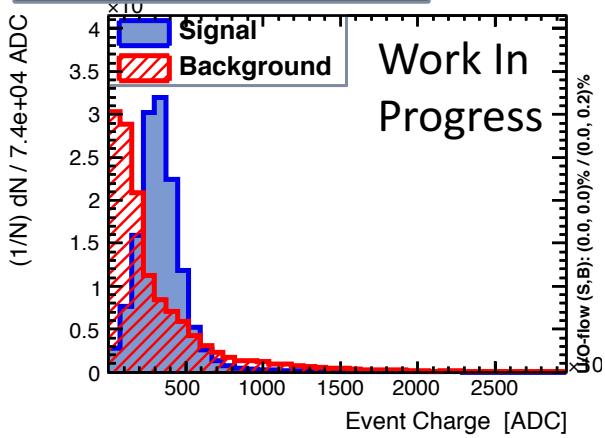


The ν_μ selection

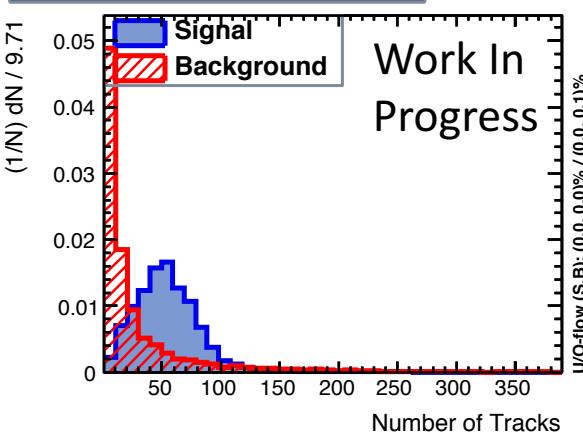


The ν_e selection

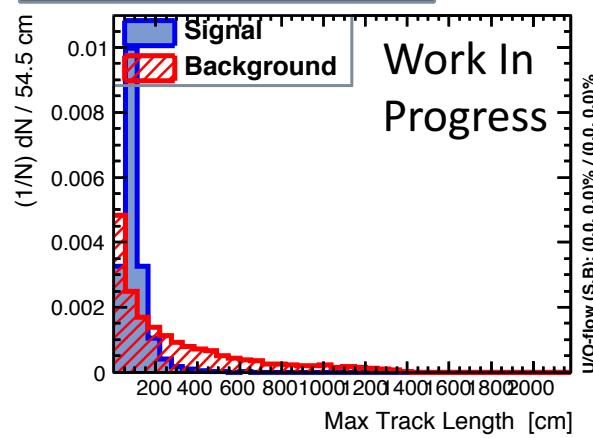
TMVA Input Variables: Event Charge



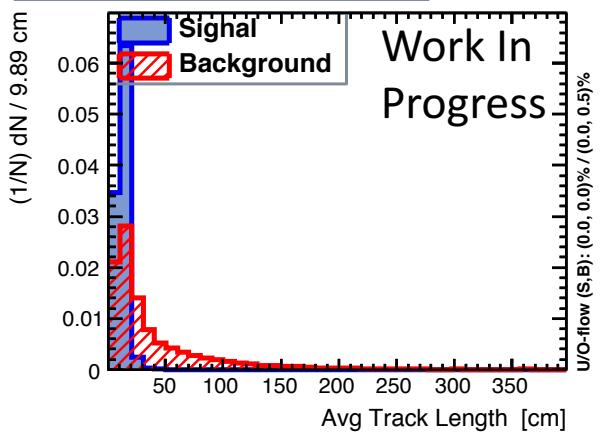
TMVA Input Variables: Number of Tracks



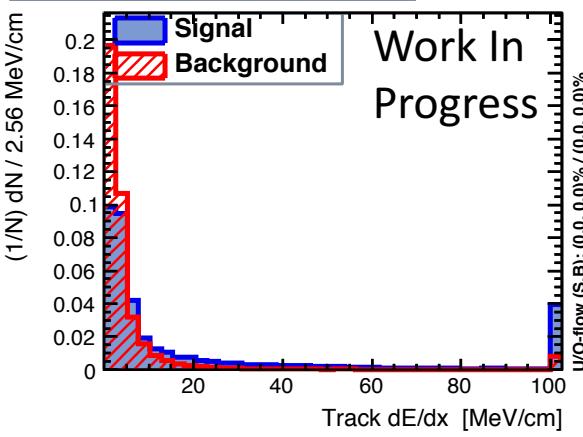
TMVA Input Variables: Max Track Length



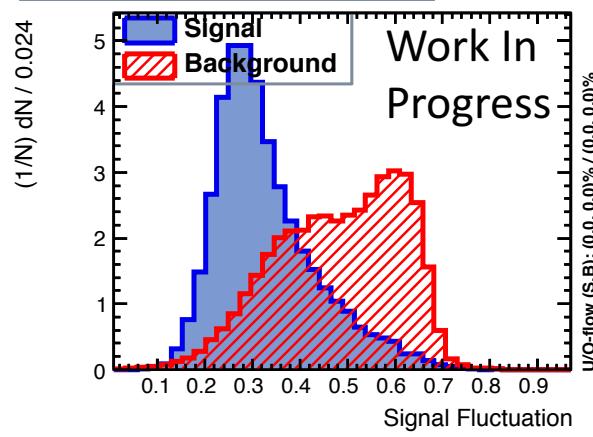
TMVA Input Variables: Avg Track Length



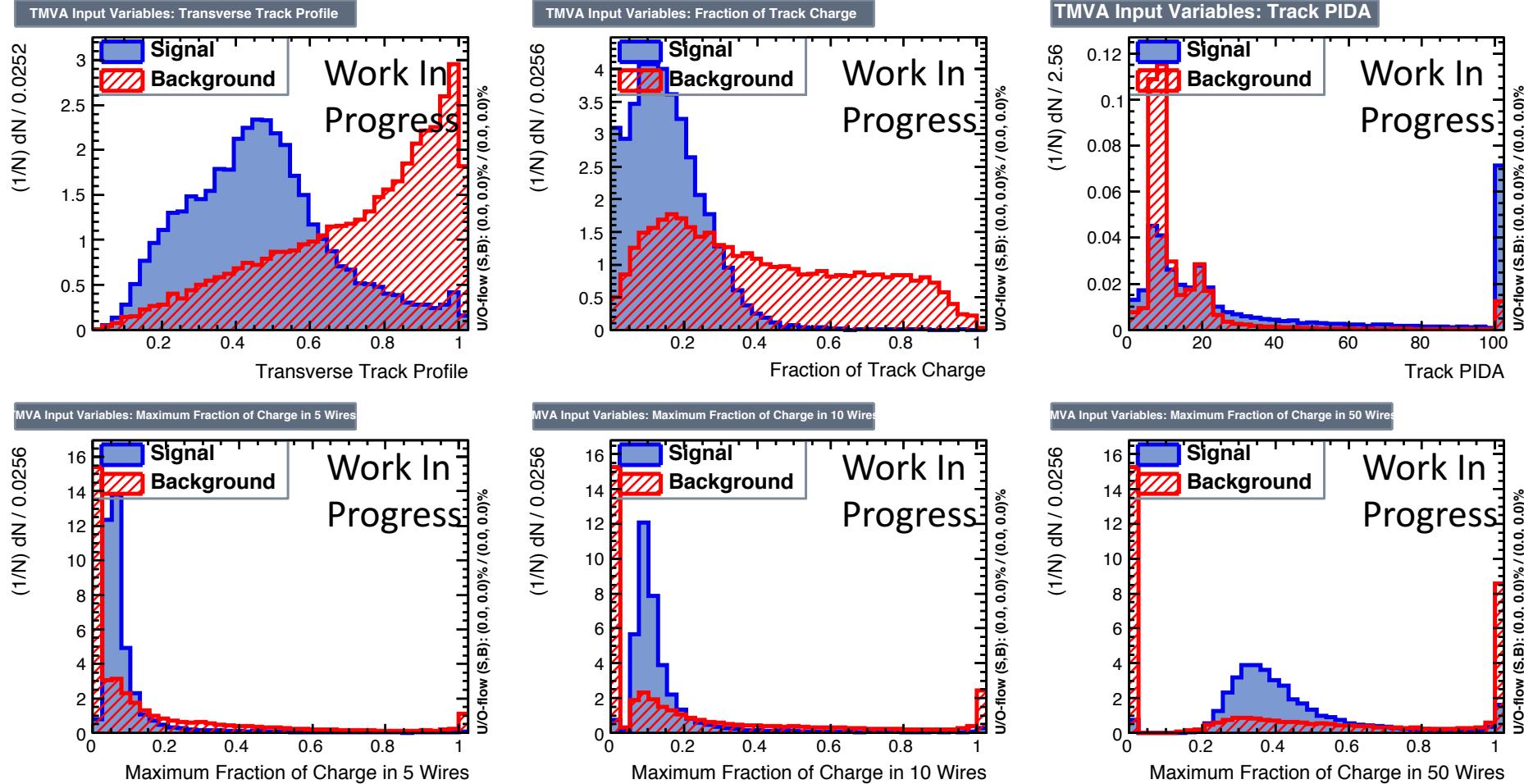
TMVA Input Variables: Track dE/dx



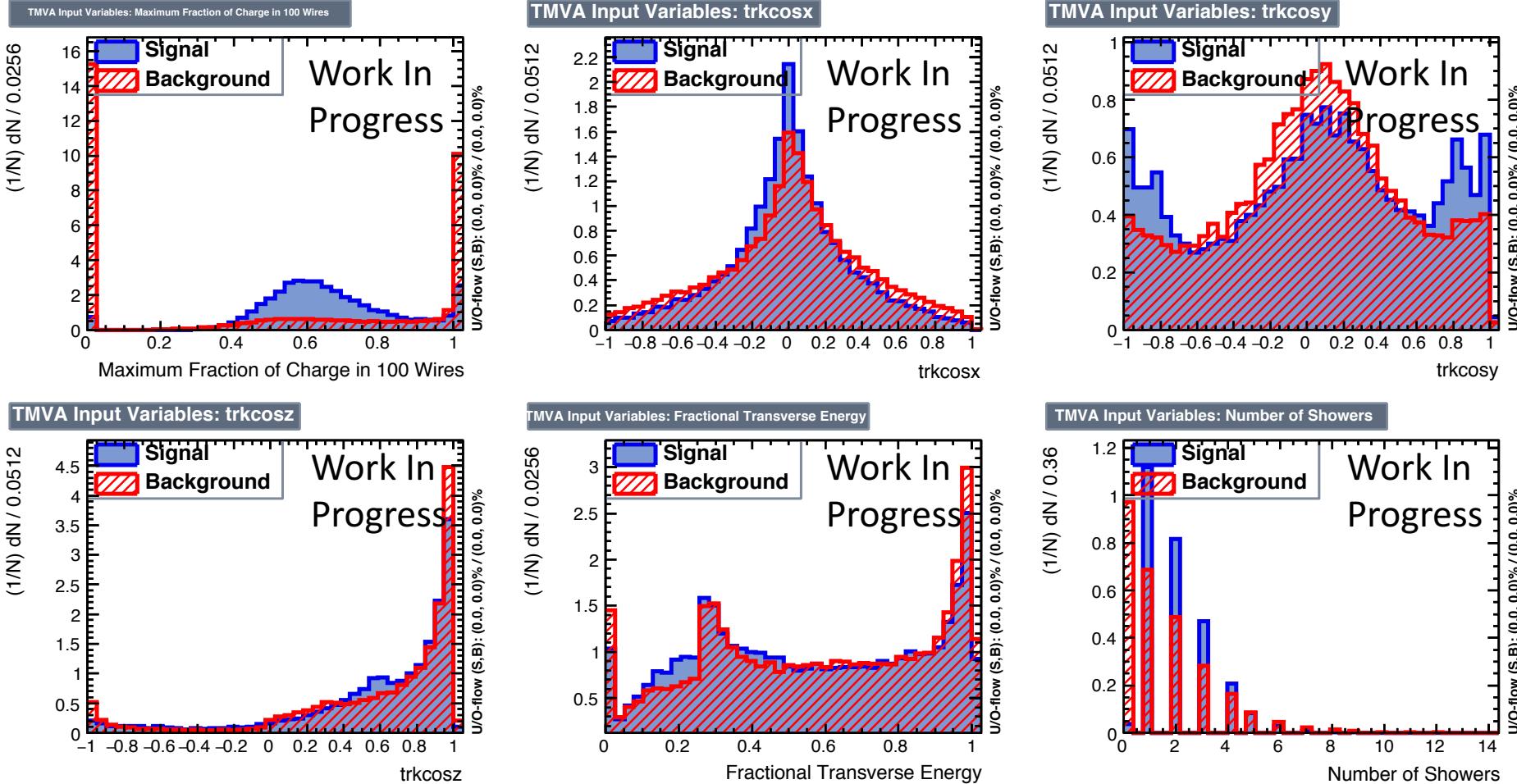
TMVA Input Variables: Signal Fluctuation



The ν_e selection

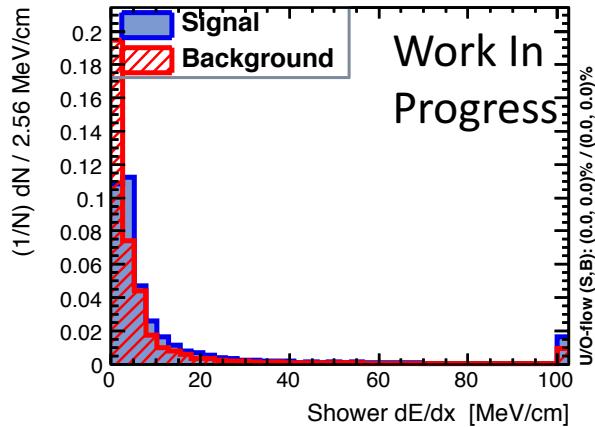


The ν_e selection

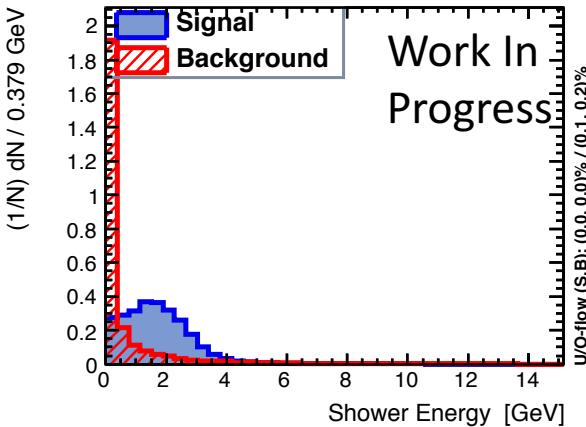


The ν_e selection

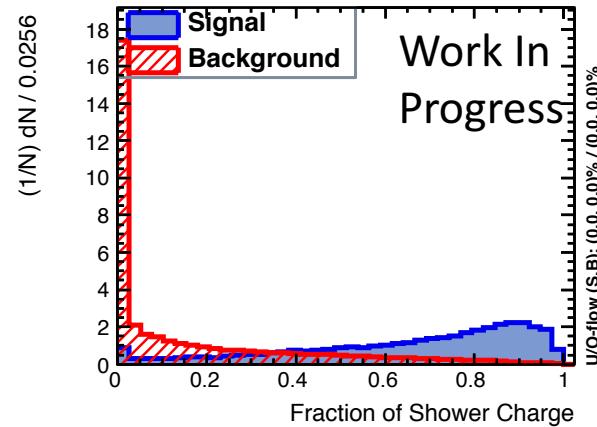
TMVA Input Variables: Shower dE/dx



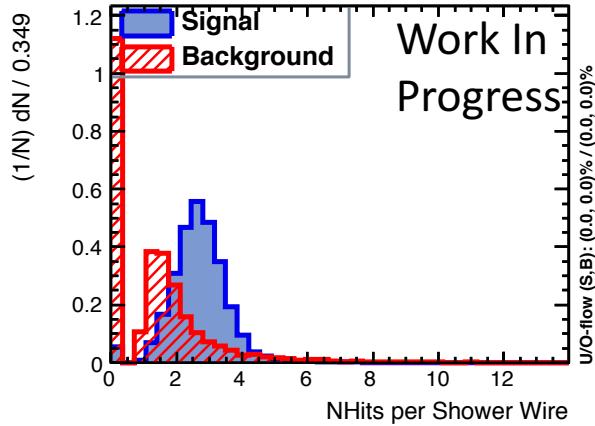
TMVA Input Variables: Shower Energy



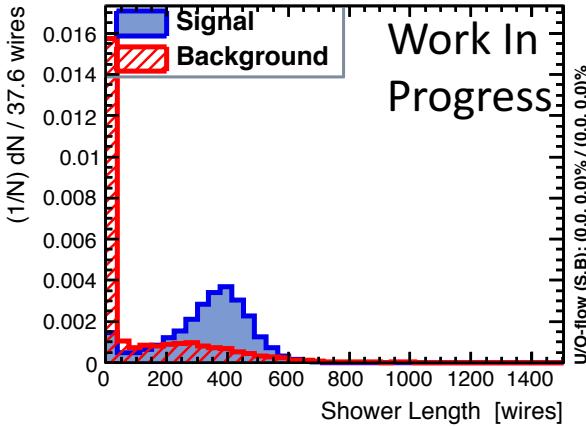
TMVA Input Variables: Fraction of Shower Charge



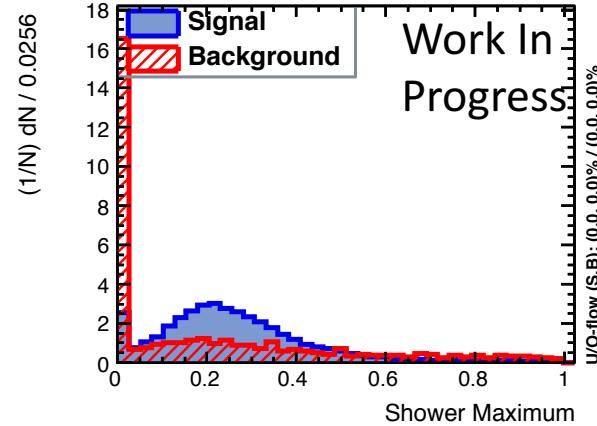
TMVA Input Variables: NHits per Shower Wire



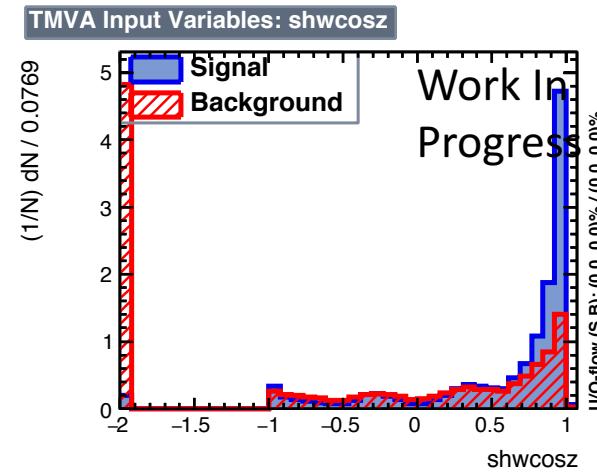
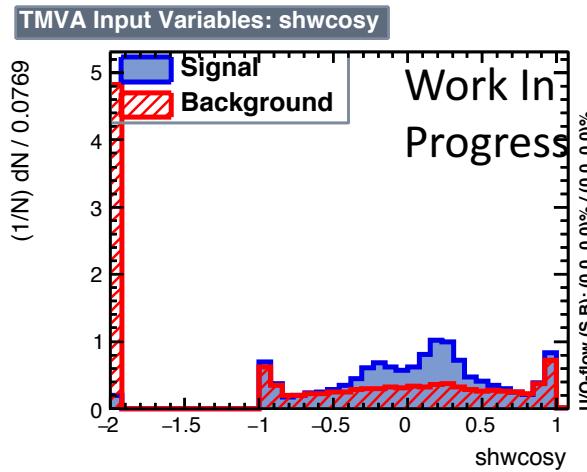
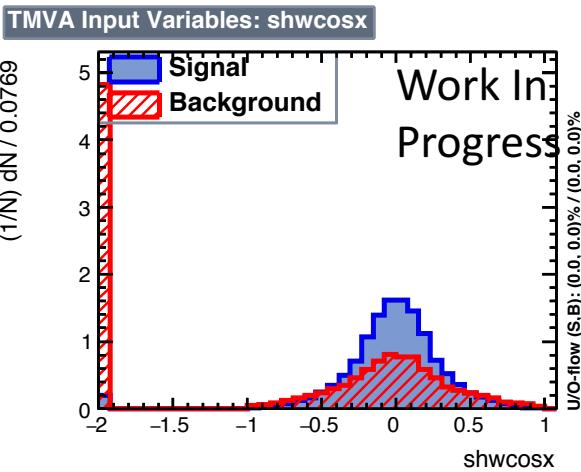
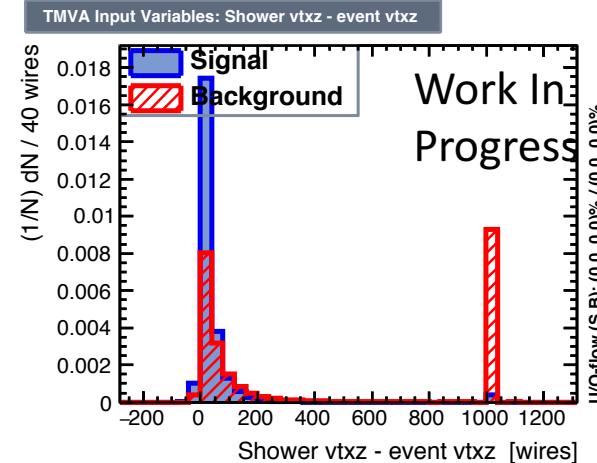
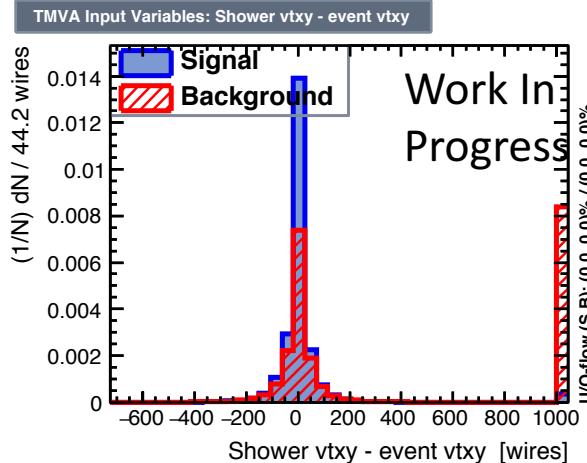
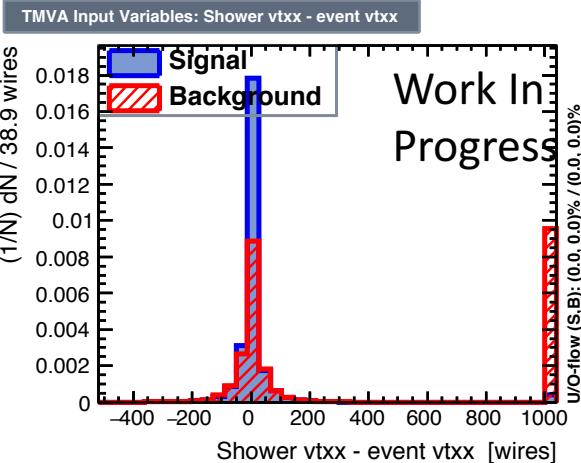
TMVA Input Variables: Shower Length



TMVA Input Variables: Shower Maximum



The ν_e selection



The who?



- Large science collaboration
 - 950+ scientists
 - 164 institutions
 - 30+ countries